

# Constraints on Low Cloud Feedbacks from Observed Climate Variability

Tim Myers<sup>1</sup>, Ryan Scott<sup>2,3</sup>, Mark Zelinka<sup>1</sup>, Steve Klein<sup>1</sup>, Joel Norris<sup>2</sup>, Peter Caldwell<sup>1</sup>

<sup>1</sup>Lawrence Livermore National Laboratory

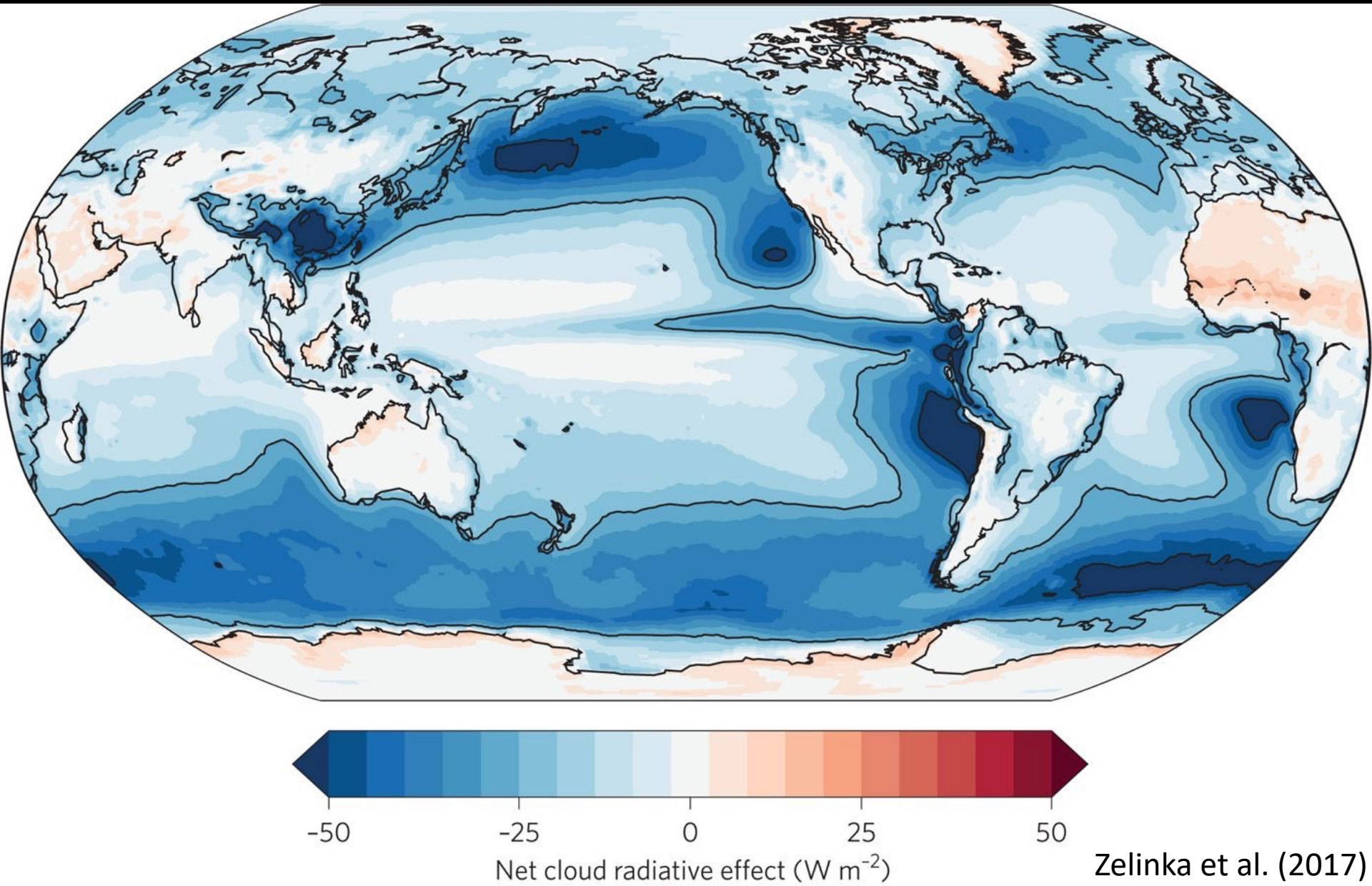
<sup>2</sup>Scripps Institution of Oceanography

<sup>3</sup>Science Systems and Applications, Inc.

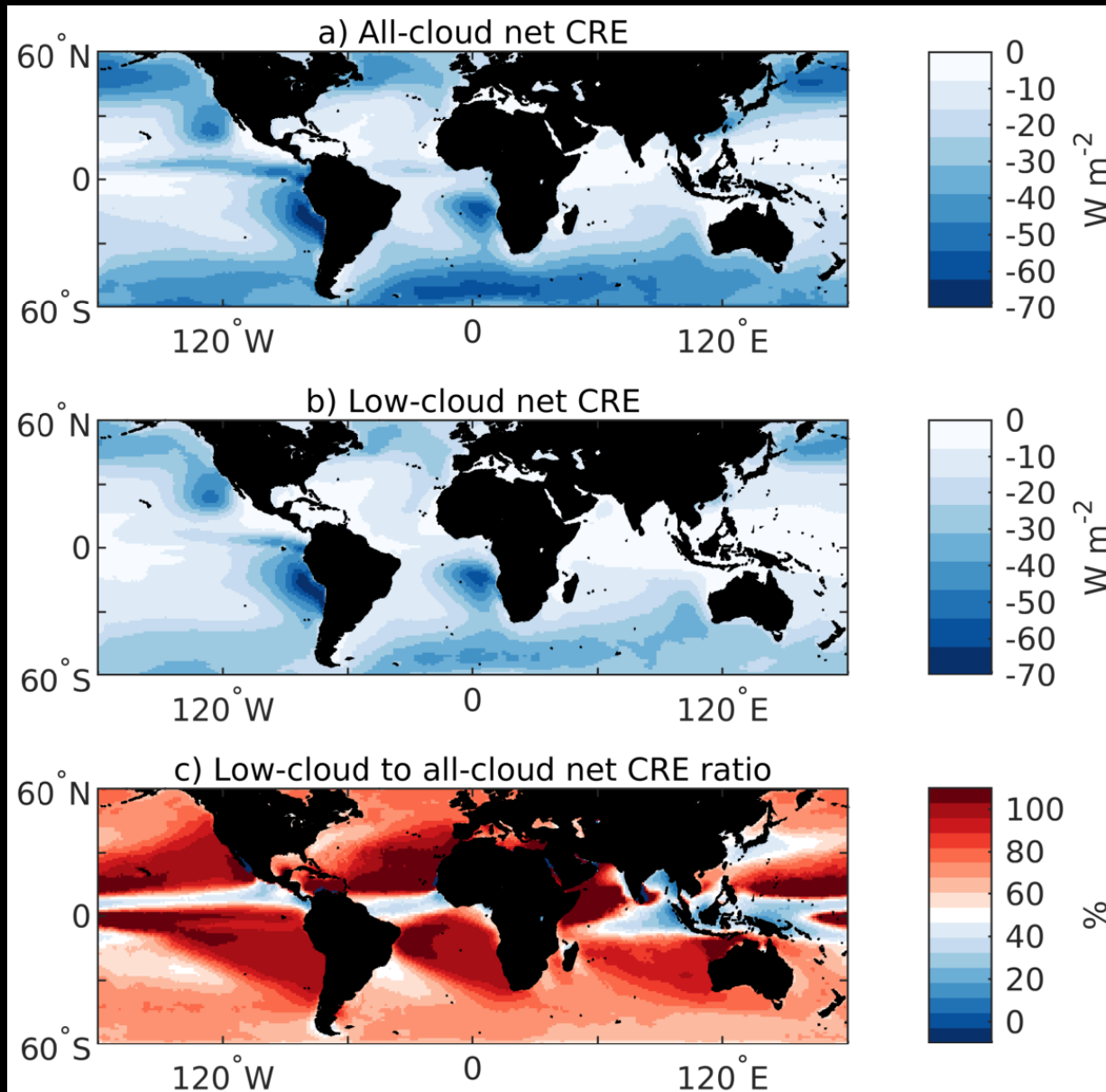
A view from the International Space Station (NASA)



# Climatology of Net Cloud Radiative Effect from CERES-EBAF



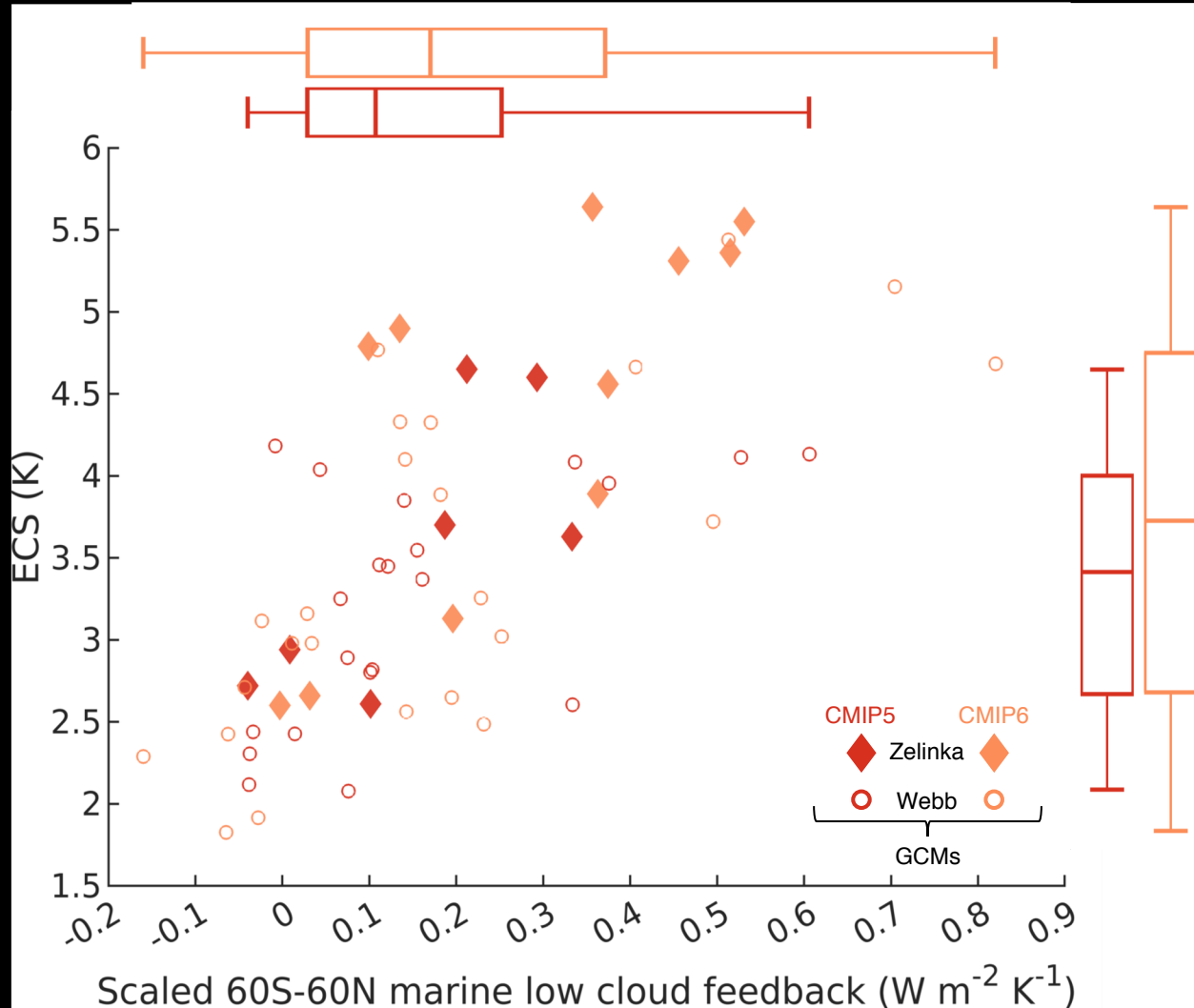
# Low Clouds: Primary Contributor to net CRE over Global Oceans



CERES  
Flux-by-Cloud-Type  
Dataset

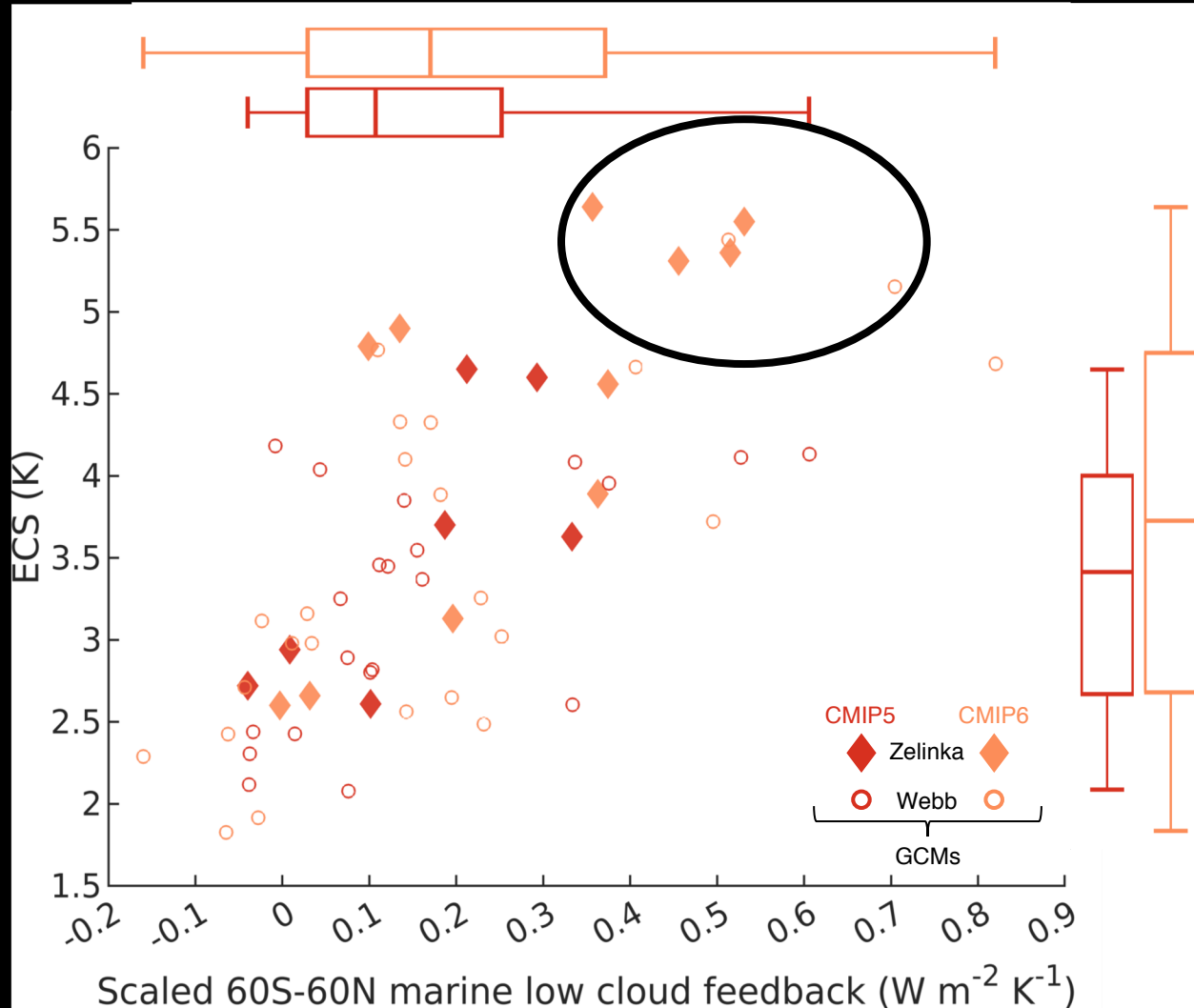
Myers et al.,  
upcoming AGU Monograph

In CMIP6, spread of low cloud feedback and ECS has increased relative to CMIP5

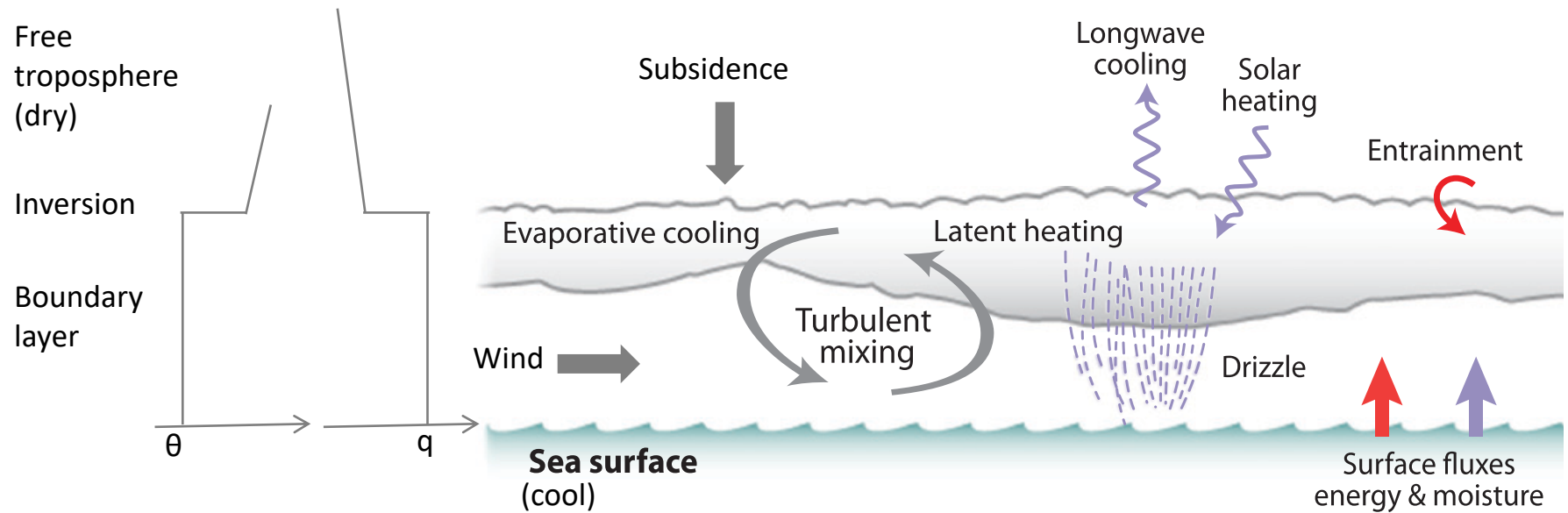




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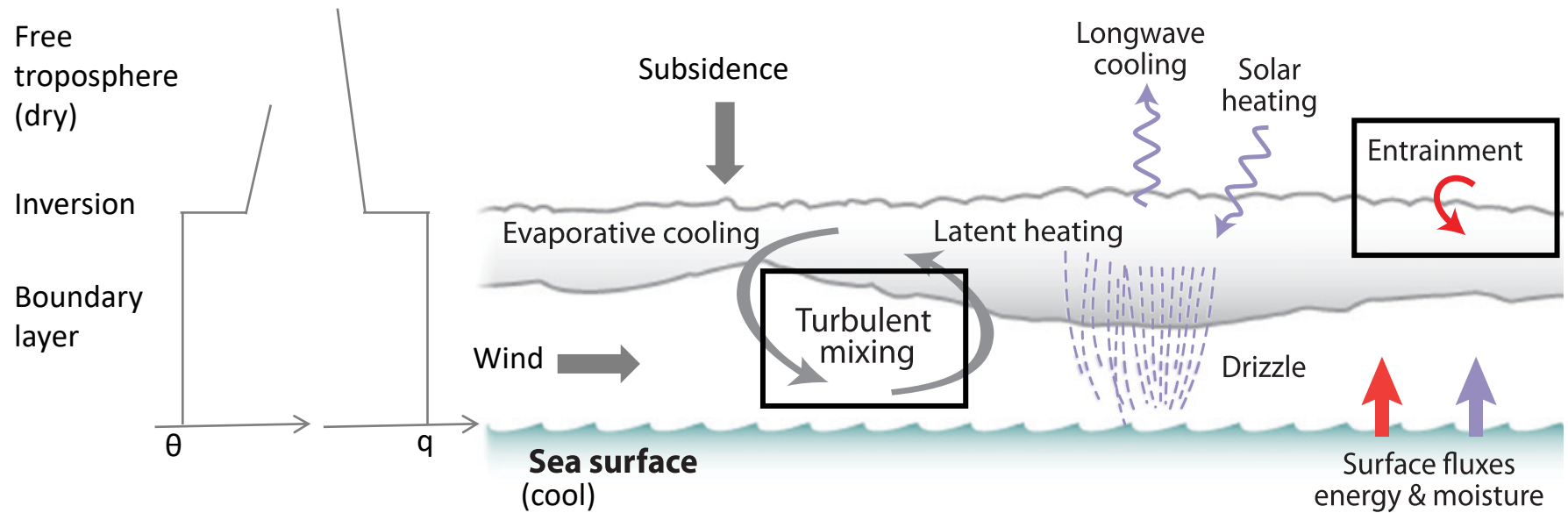


# Parameterization of unresolved boundary layer process likely explains model uncertainty

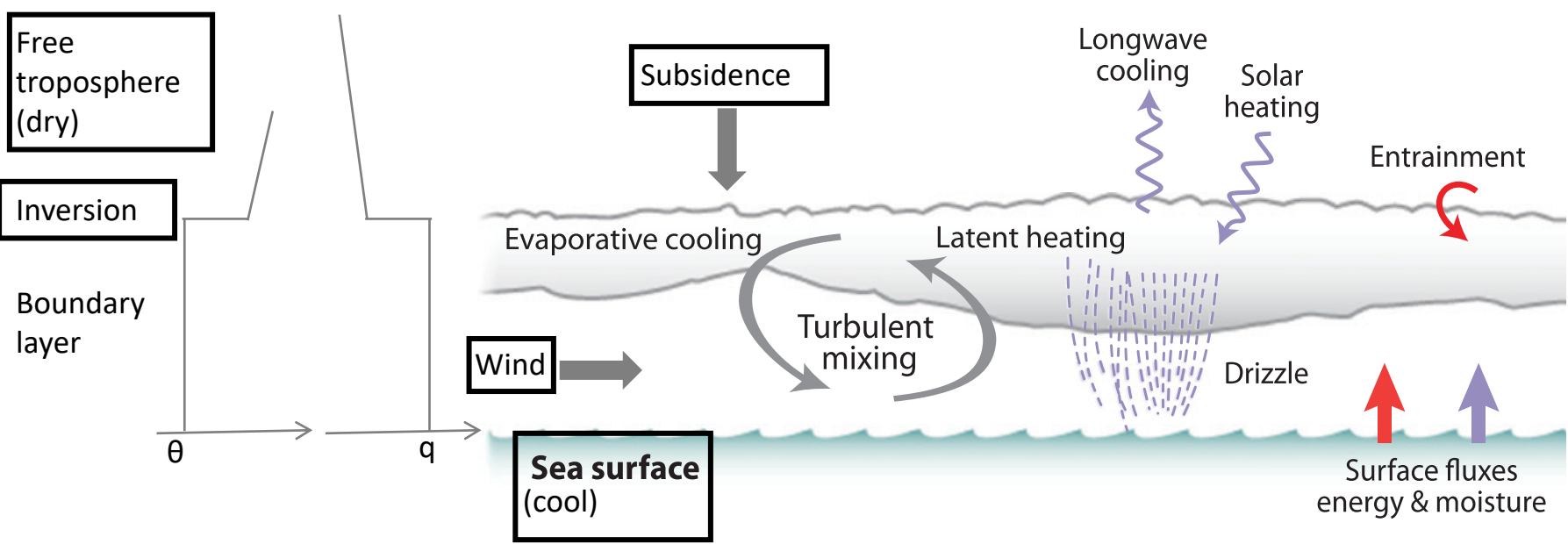




# Parameterization of unresolved boundary layer process likely explains model uncertainty



# External Cloud-Controlling Factors





# Framework to Observationally Constrain Low Cloud Feedbacks

Given

- i. spatially-resolved sensitivity of low cloud radiative fluxes to meteorological cloud-controlling factors from observed climate variability  
( *meteorological cloud radiative kernels developed by Scott et al. (2020)*)
- ii. how these factors will change in response to climate warming  
(*resolved by GCMs*)

we can predict the marine low cloud feedback.

Not first to apply this framework\*.

Our study is unique in its near-global scale and its constraints on the pattern of the low feedback.

\*Qu et al. 2015; Zhai et al. 2015;  
Myers and Norris 2016; Brient and  
Schneider 2016; McCoy et al. 2017;  
Cesana and Del Genio 2021



# Framework to Observationally Constrain Low Cloud Feedbacks

We decompose the low cloud feedback at each 5° x 5° ocean grid box between 60°S and 60°N as

$$\lambda_{cloud} = \frac{dR}{dT} = \sum \frac{\partial R}{\partial x_i} \frac{dx_i}{dT}$$

$R$  low cloud radiative flux

$x_i$  one of six cloud-controlling factors

$T$  global mean surface temperature

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$T$  global mean surface temperature

$$\frac{\partial R}{\partial x_i}$$

**observation-based** sensitivity of low cloud radiative flux to a perturbation in some cloud-controlling factor  
(*meteorological cloud radiative kernels from Scott et al. (2020)*)

$$\frac{dx_i}{dT}$$

change in cloud-controlling factor per degree global mean warming,  
**predicted by 18 CMIP5 and CMIP6 models in abrupt4xCO2 simulations**

# Framework to Observationally Constrain Low Cloud Feedbacks

Complete set of cloud-controlling factors  $x_i$  includes (from reanalysis)

- sea-surface temperature (SST)

- estimated inversion strength (EIS)

- horizontal surface temp. advection

- free-tropospheric relative humidity

- free-tropospheric subsidence

- near-surface wind speed

# Using Satellite Cloud Observations to Constrain the Feedback

How do we estimate low cloud radiative anomalies  $R'$  globally?

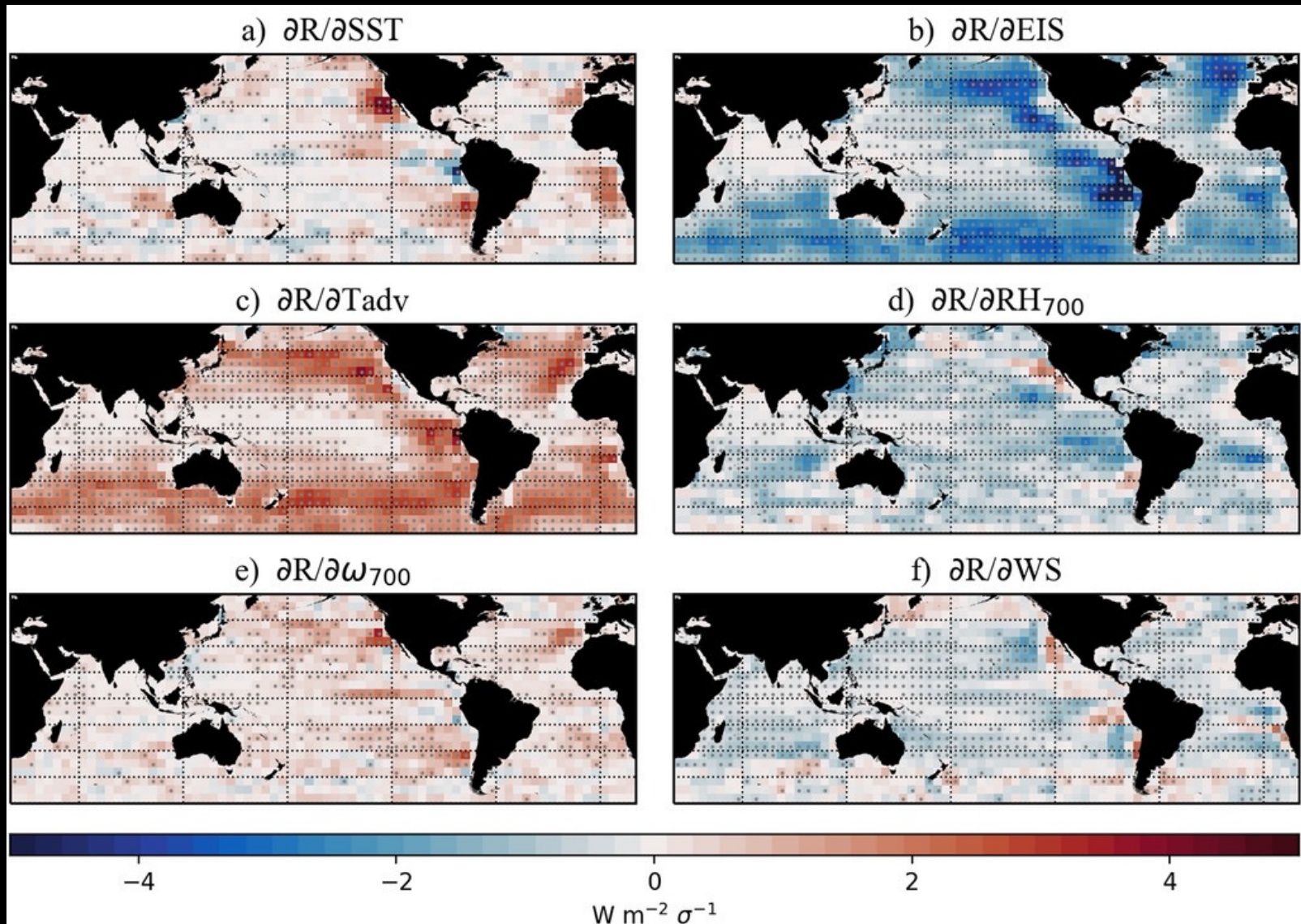
We apply Zelinka cloud radiative kernels  $k = k(\tau, p)$  to satellite-retrieved low-level (>680 hPa) cloud fraction  $L = L(\tau, p)$  normalized by the fraction  $F$  of the grid box unobscured by higher-level clouds:

$$R' = \bar{F} \sum_{p=1}^2 \sum_{\tau=1}^T k(L/F)'$$

Cloud fraction histograms from  
**MODIS (TERRA+AQUA), ISCCP, PATMOS-x**

- These fluxes are exclusively due to changes in unobscured low-level clouds
- We apply a similar equation to the **CERES Flux-by-Cloud-Type dataset**

# Observational Meteorological Cloud Radiative Kernels



derived from July 2002 – December 2018 CERES-FBCT data

Scott et al. (2020)



Validation of the multi-linear approach

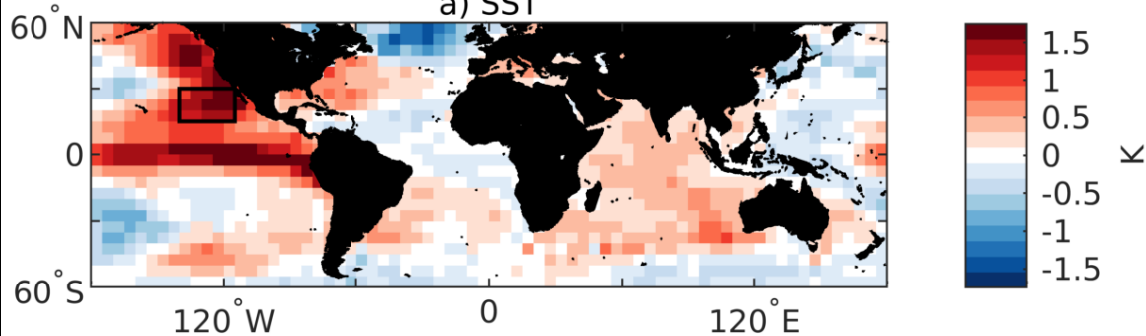
How well does the method predict out-of-sample extremes in the observational record?

Test Case: Northeast Pacific Marine Heatwave

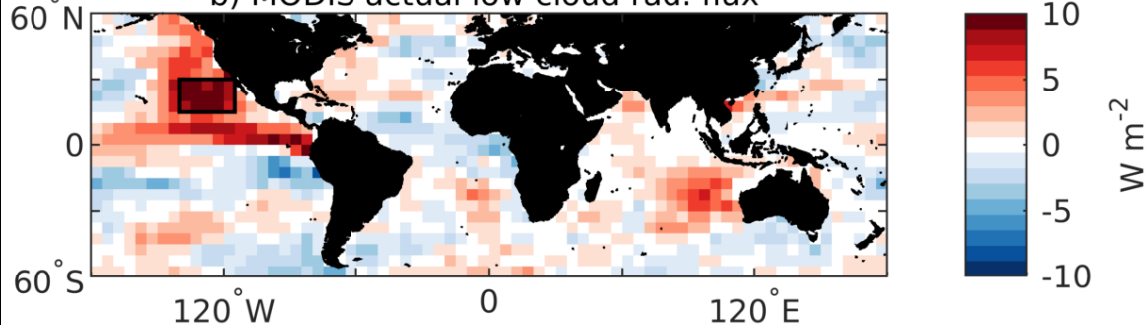
# Marine Heatwave Test Case

2015 mean anomalous

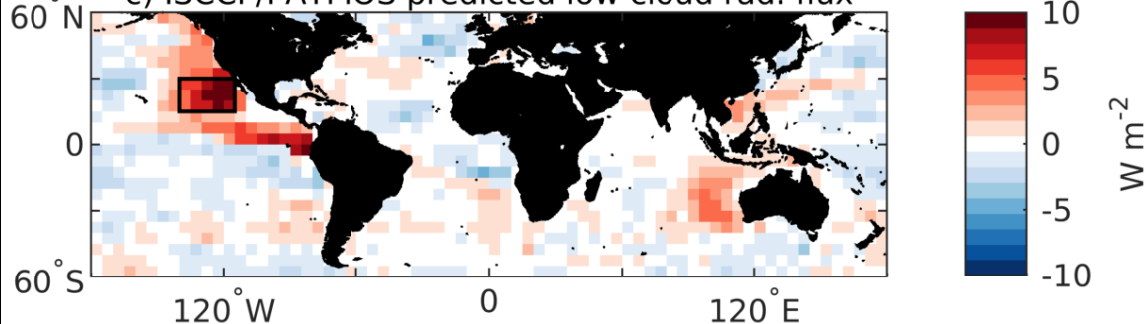
a) SST



b) MODIS actual low cloud rad. flux



c) ISCCP/PATMOS predicted low cloud rad. flux

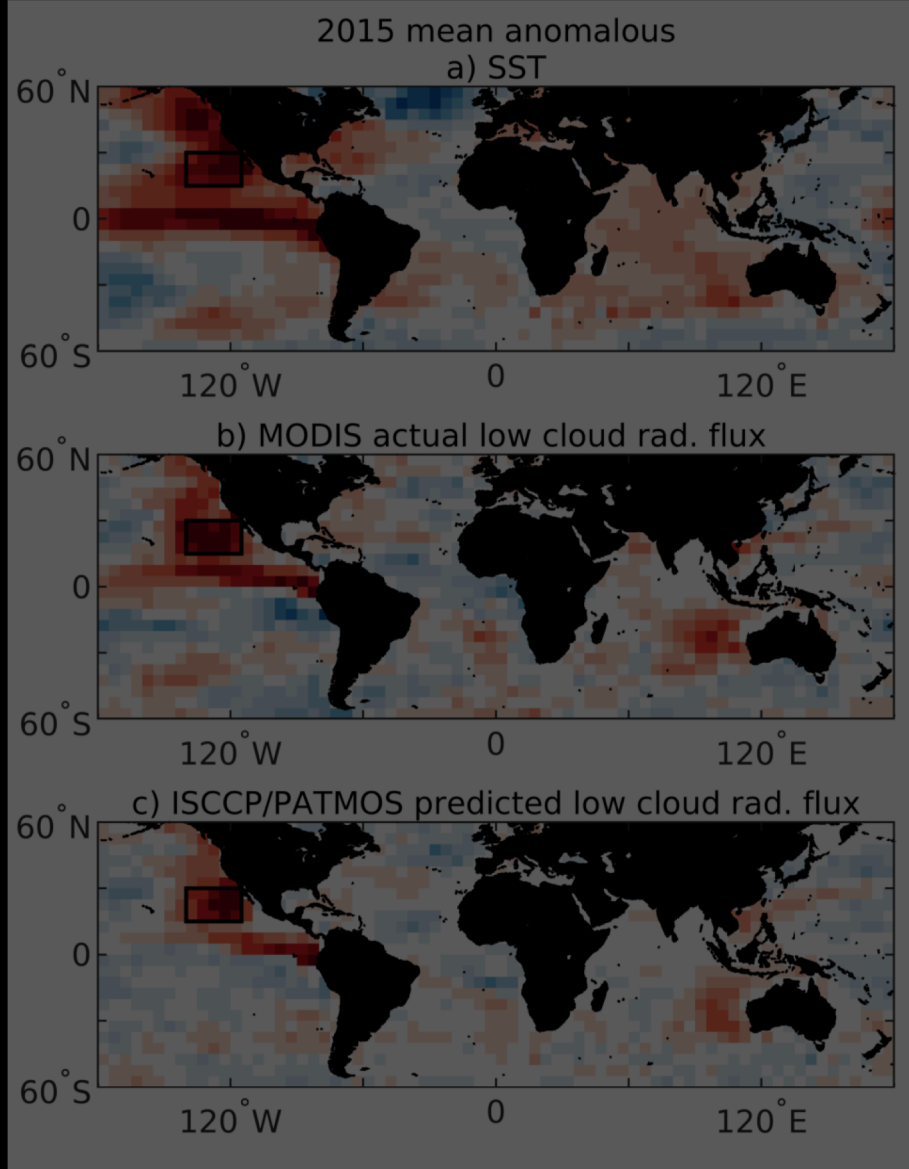


2015 observations

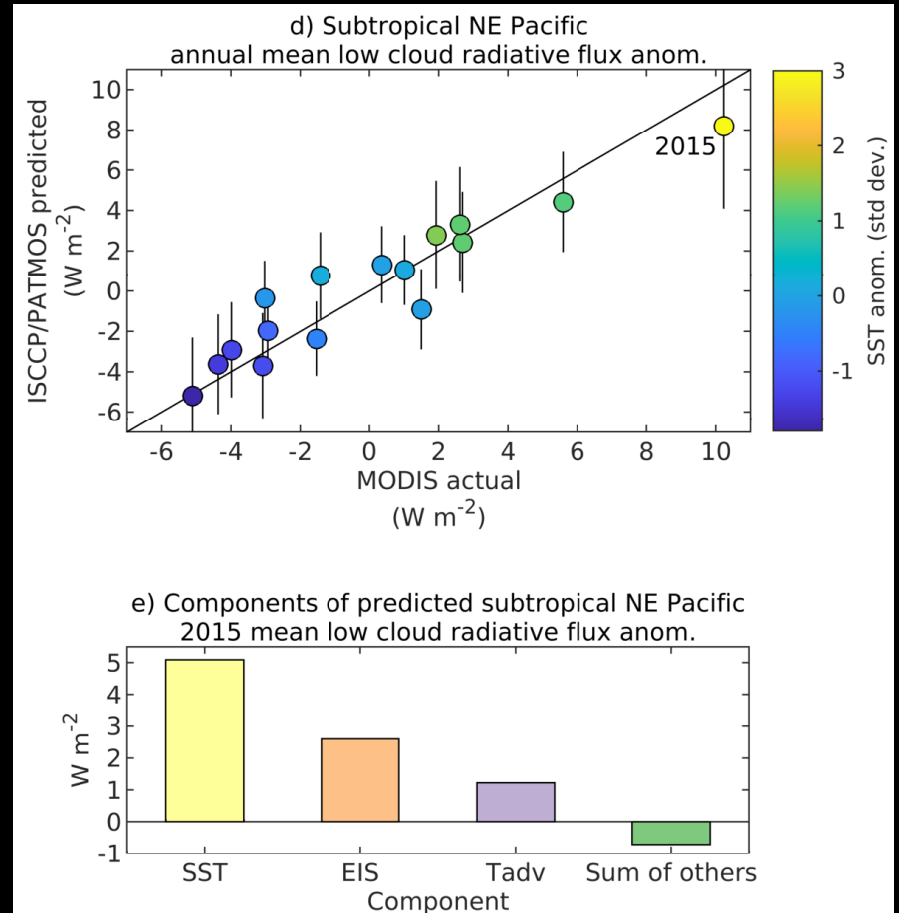
Out-of-sample  
prediction

based on 1983-2002-derived  
*meteorological kernels*

# Marine Heatwave Test Case



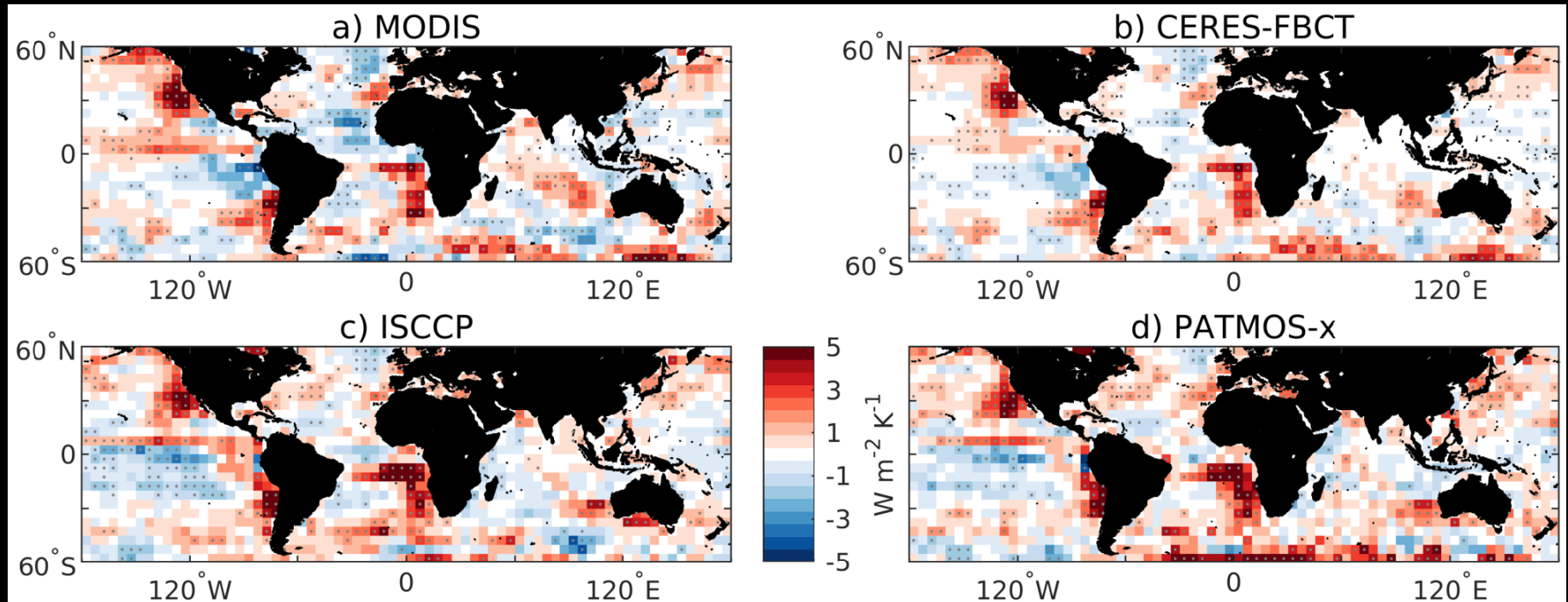
The linear method is valid for SST perturbations spanning  $\sim 2.4$  K



Increasing SST was the primary driver of the low cloud reduction

# Results: Feedback Constrained by Satellite Cloud Observations

$$\lambda_{cloud} = \frac{dR}{dT} = \sum \frac{\partial R}{\partial x_i} \frac{dx_i}{dT}$$



- Positive feedback in eastern ocean basins and middle latitude North Pacific
- Weaker feedback in trade cumulus regions

Which cloud-controlling factors drive this feedback?

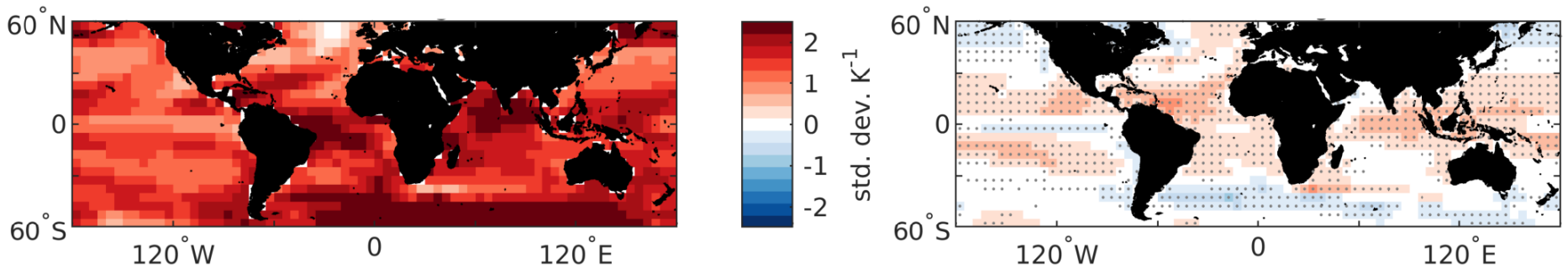


# Dominant Feedback Components: SST and Est. Inv. Strength

$$\frac{dSST}{dT}$$

Due to 4xCO<sub>2</sub>

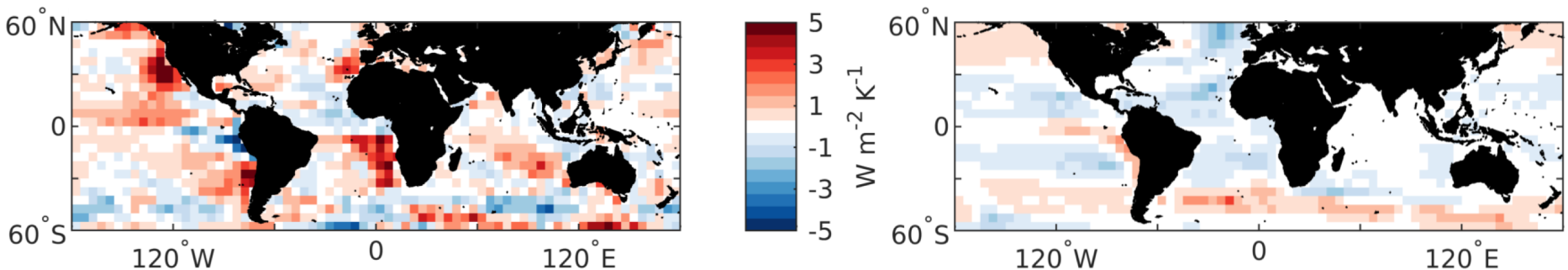
$$\frac{dEIS}{dT}$$



$$\frac{\partial R}{\partial SST} \frac{dSST}{dT}$$

Feedback component

$$\frac{\partial R}{\partial EIS} \frac{dEIS}{dT}$$



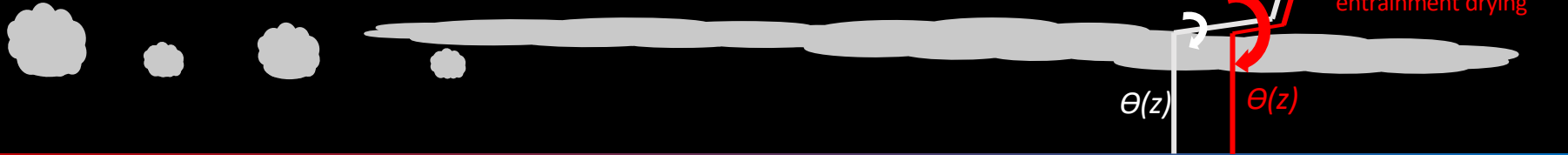
Strong positive SST-driven feedback in eastern ocean basins

Positive EIS-driven feedback in midlatitudes

Negative EIS-driven feedback in tropics

What physical mechanisms produce these feedback components?

## Meteorological conditions inducing a positive low cloud feedback



Tropical Ascent

Trade Cumulus

Eastern Ocean Stratocumulus

Midlatitudes

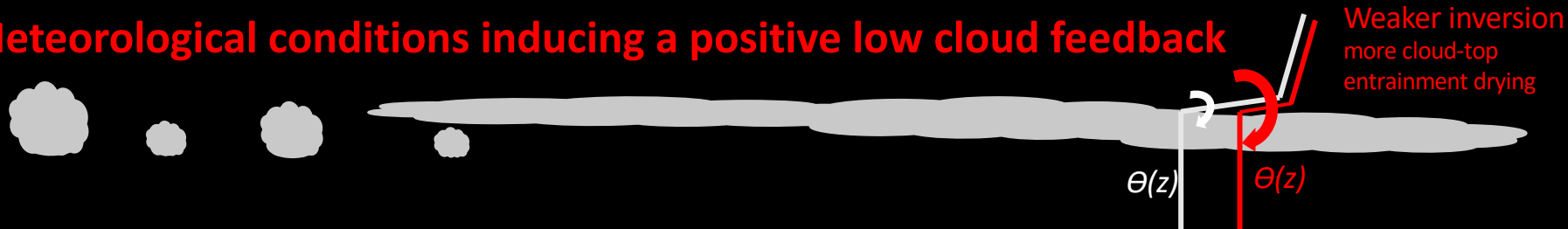
Warmer SST

Warmer SST

stronger upward surface latent heat flux  
more cloud-top entrainment drying

Warmer SST

## Meteorological conditions inducing a positive low cloud feedback



Tropical Ascent

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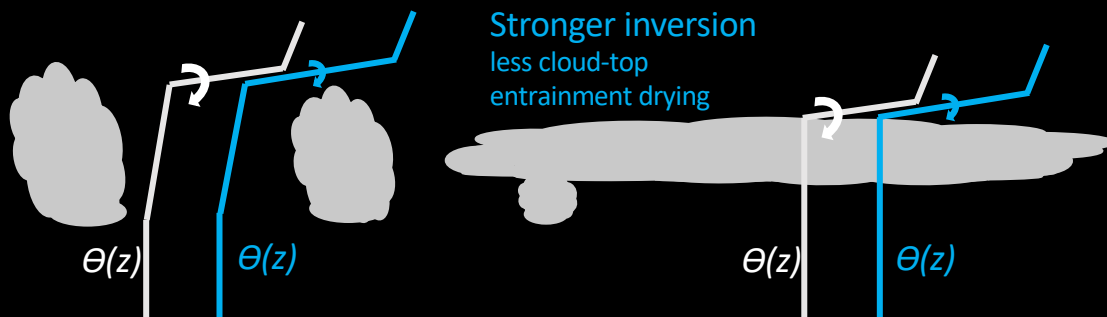
Warmer SST

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stronger upward surface latent heat flux  
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Warmer SST

## Meteorological conditions inducing a \*small\* negative low cloud feedback



Tropical Ascent

Trade Cumulus

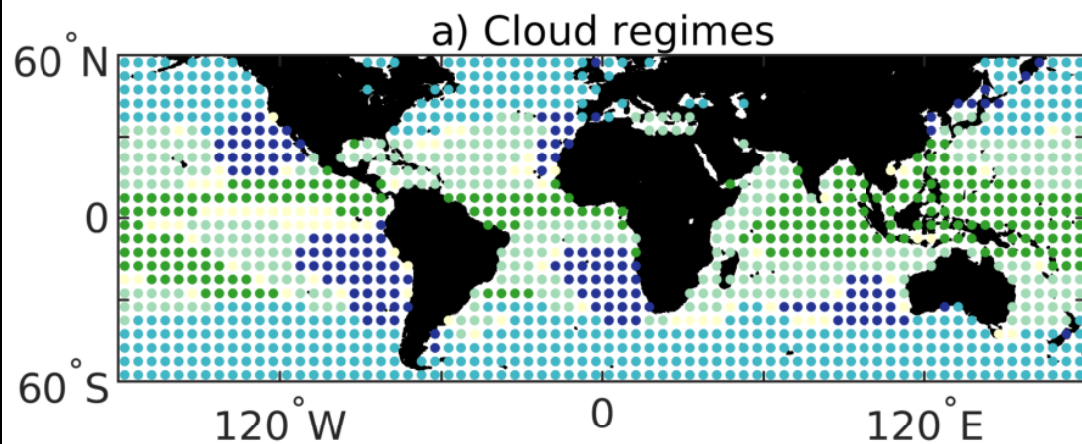
Eastern Ocean Stratocumulus

Stronger inversion  
less cloud-top  
entrainment drying

Regime-partitioned cloud feedbacks

(defined using climatological EIS,  $\omega_{700}$ )





## Stratocumulus

(strong subsidence, sharp inversion)

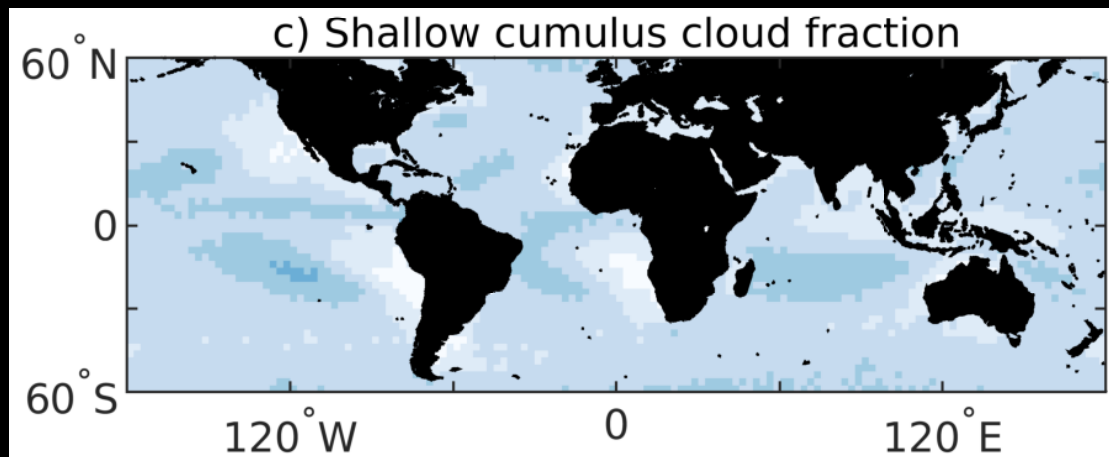
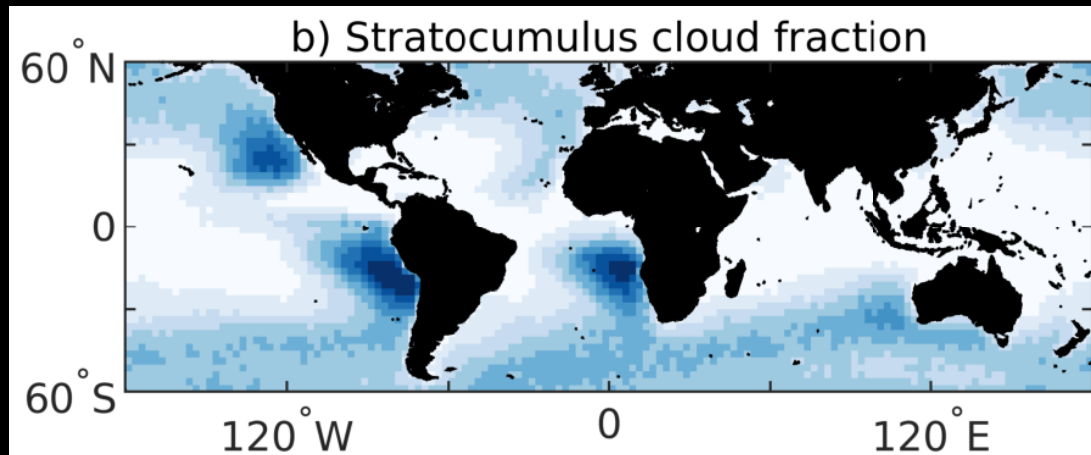
## Trade cumulus

(weak subsidence, weak inversion)

## Tropical ascent

## Midlatitudes

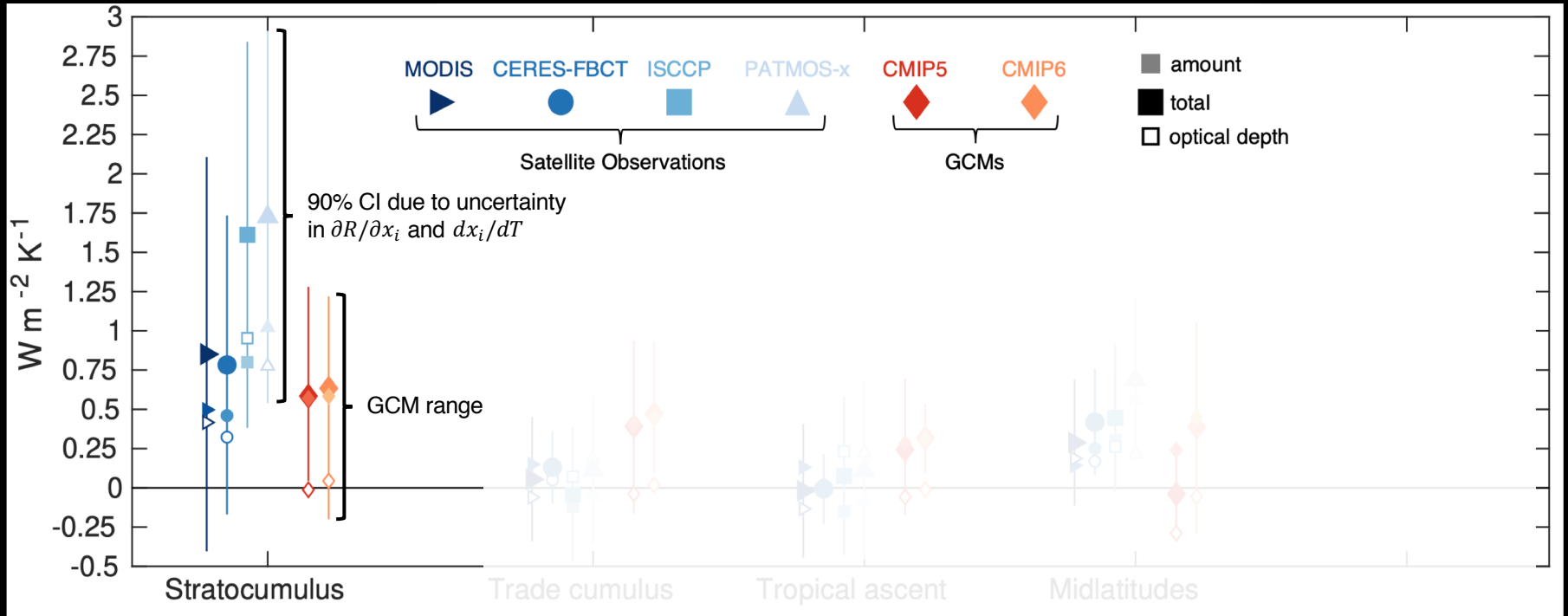
(variable  $\omega_{700}$ , sharp inversion)



Cumulus And  
Stratocumulus  
CloudSat-CALipso  
Dataset (CASCCAD;  
Cesana et al. 2019)

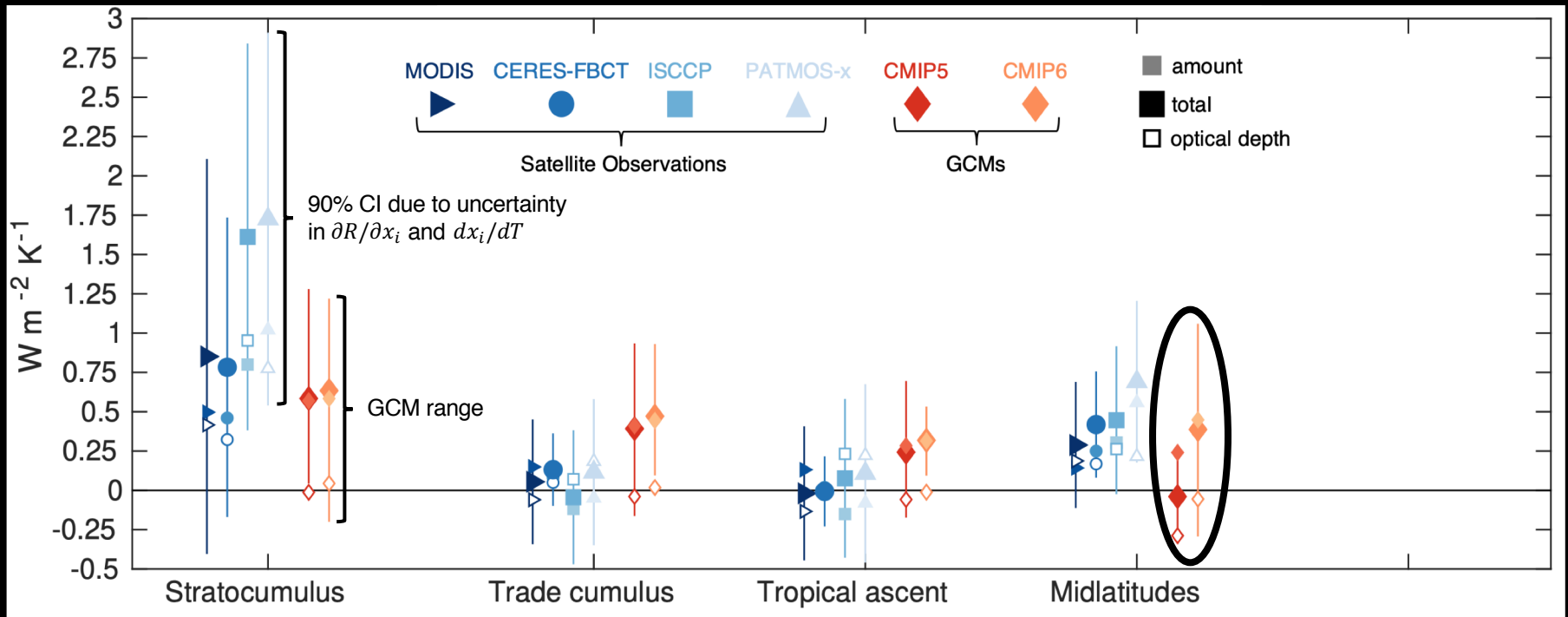
# Regime-averaged Marine Low Cloud Feedbacks

SW+LW



# Regime-averaged Marine Low Cloud Feedbacks

SW+LW



**Obs:** Positive stratocumulus & midlatitude cloud feedbacks (from amount *and* optical depth)

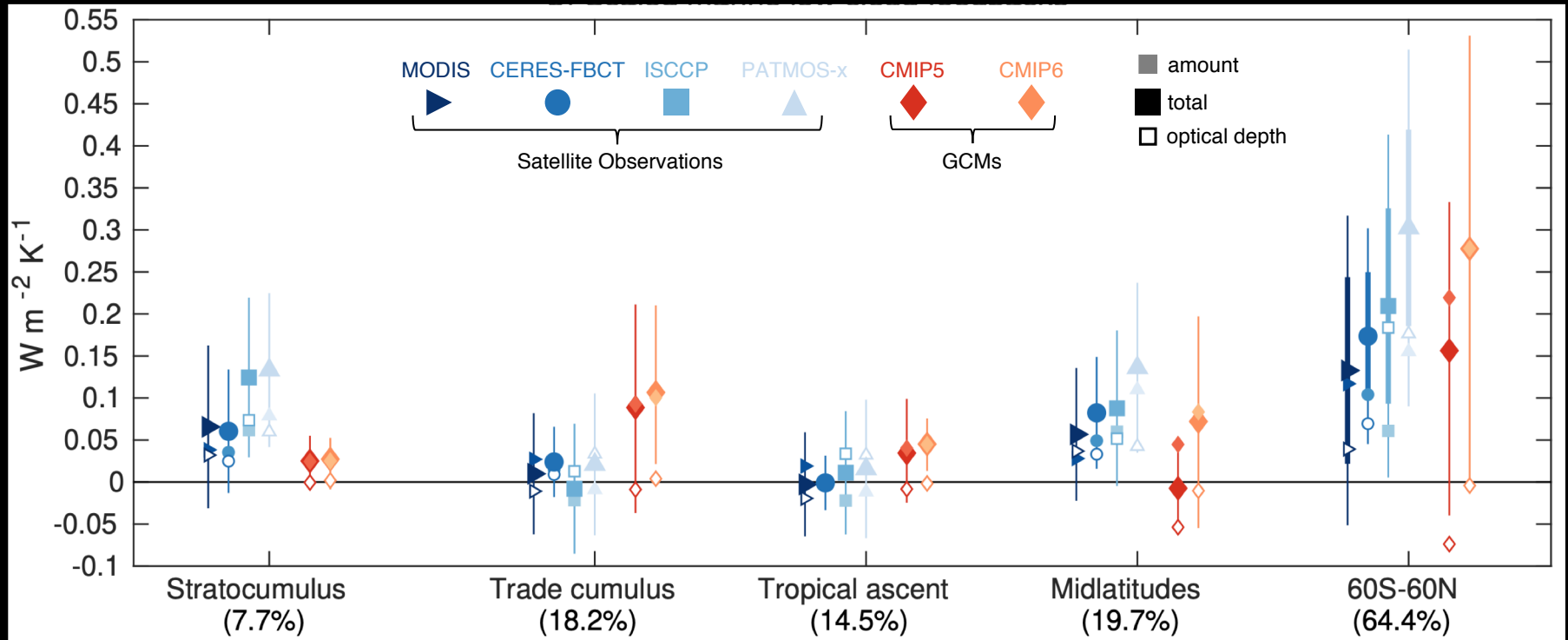
**Obs:** Near-zero trade cumulus feedback, consistent with large-eddy simulations\*

**CMIP6:** more realistic midlatitude feedback

\*e.g. Radtke et al. (2021)

# Feedbacks Scaled by Fractional Planetary Area

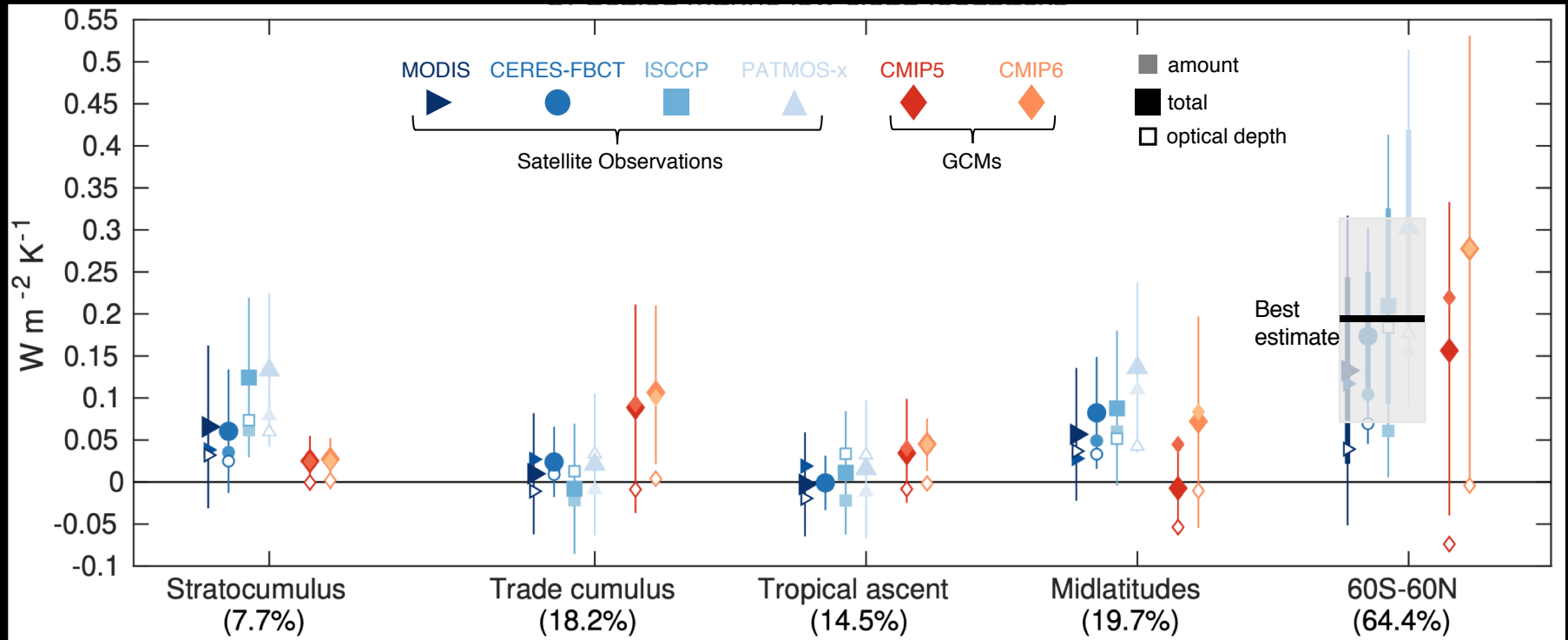
SW+LW



**Obs:** Positive 60S-60N feedback

# Feedbacks Scaled by Fractional Planetary Area

SW+LW



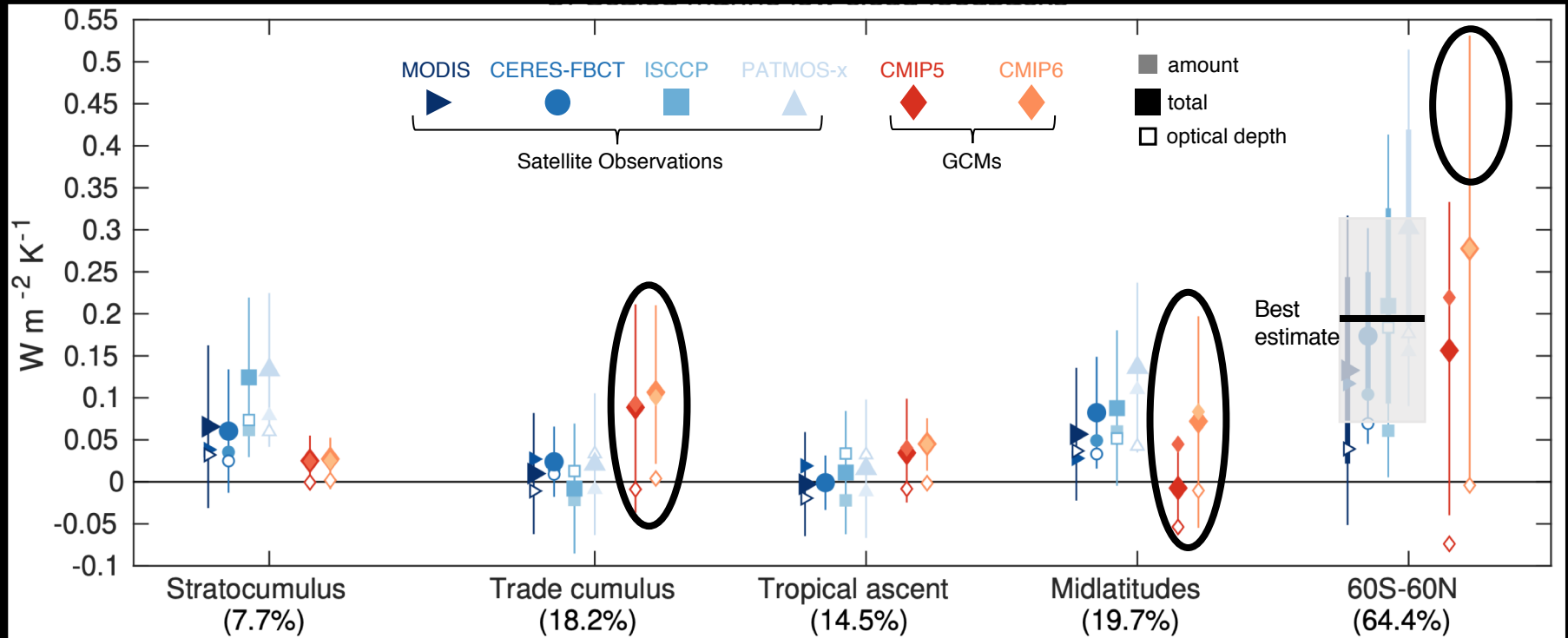
**Obs:** Positive 60S-60N feedback

$0.19 \pm 0.12 \text{ W m}^{-2} \text{K}^{-1}$



# Feedbacks Scaled by Fractional Planetary Area

SW+LW

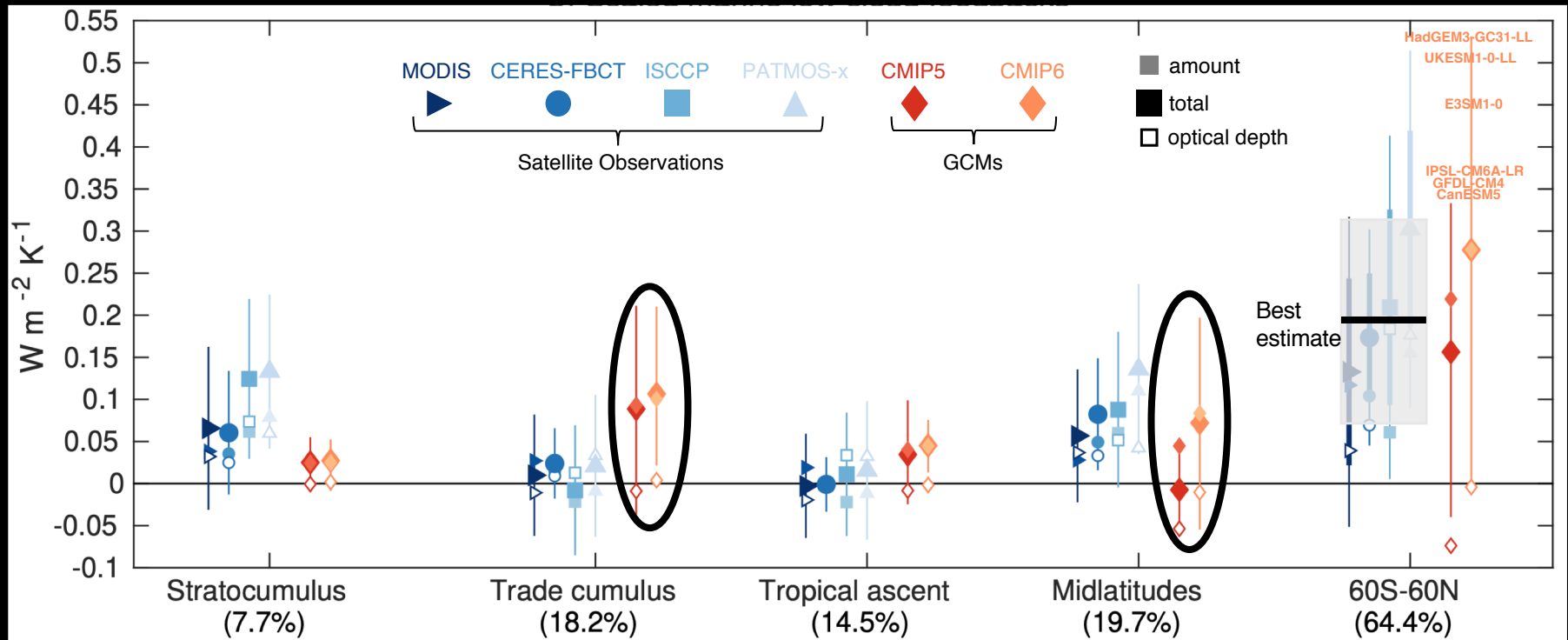


**Obs:** Positive 60S-60N feedback  
 $0.19 \pm 0.12 \text{ W m}^{-2} \text{ K}^{-1}$

**Several CMIP6 models:**  
 beyond upper limit of best estimate due to:  
 i) more realistic midlatitude feedback yet  
 ii) persistently positive trade cumulus feedback

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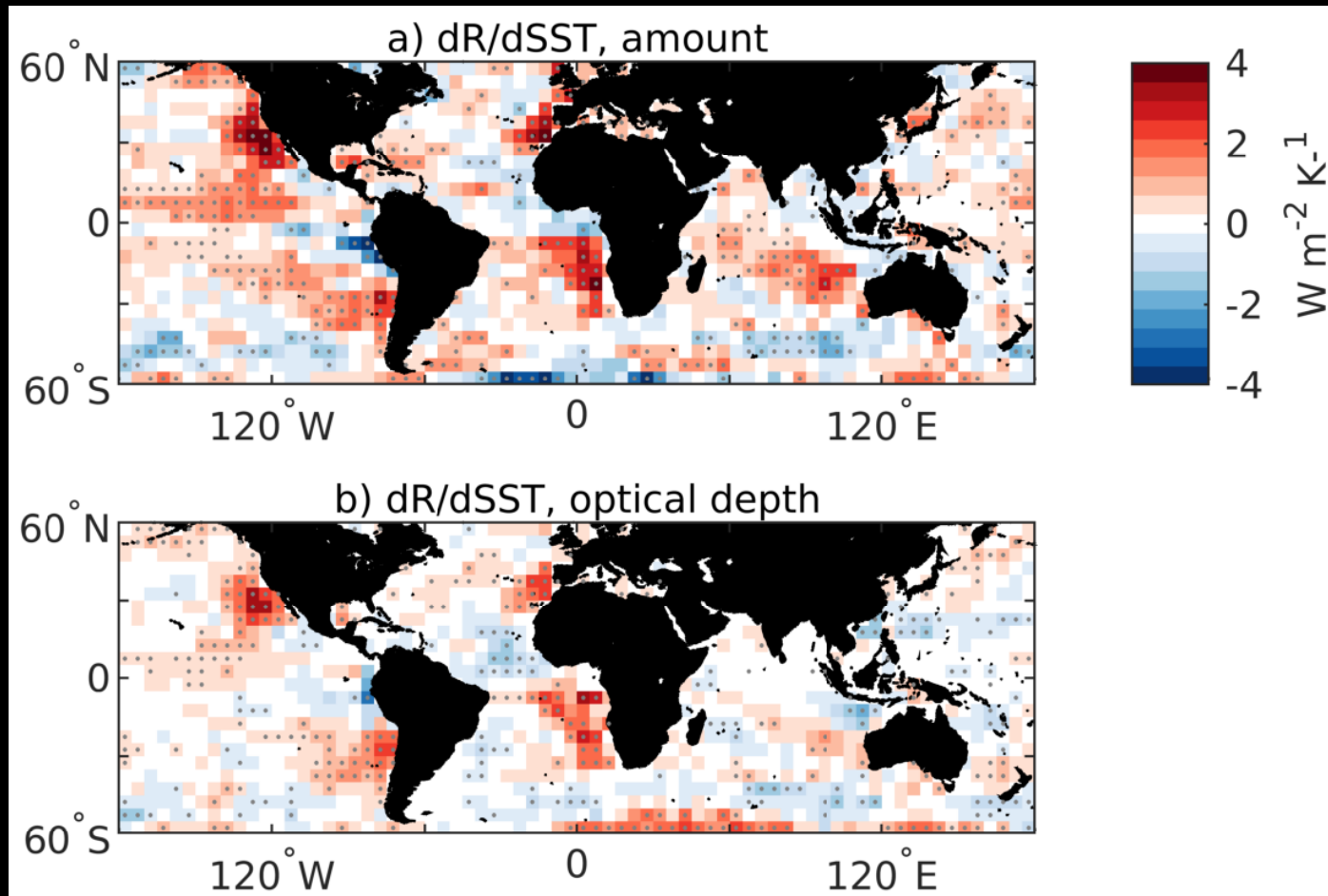
SW+LW



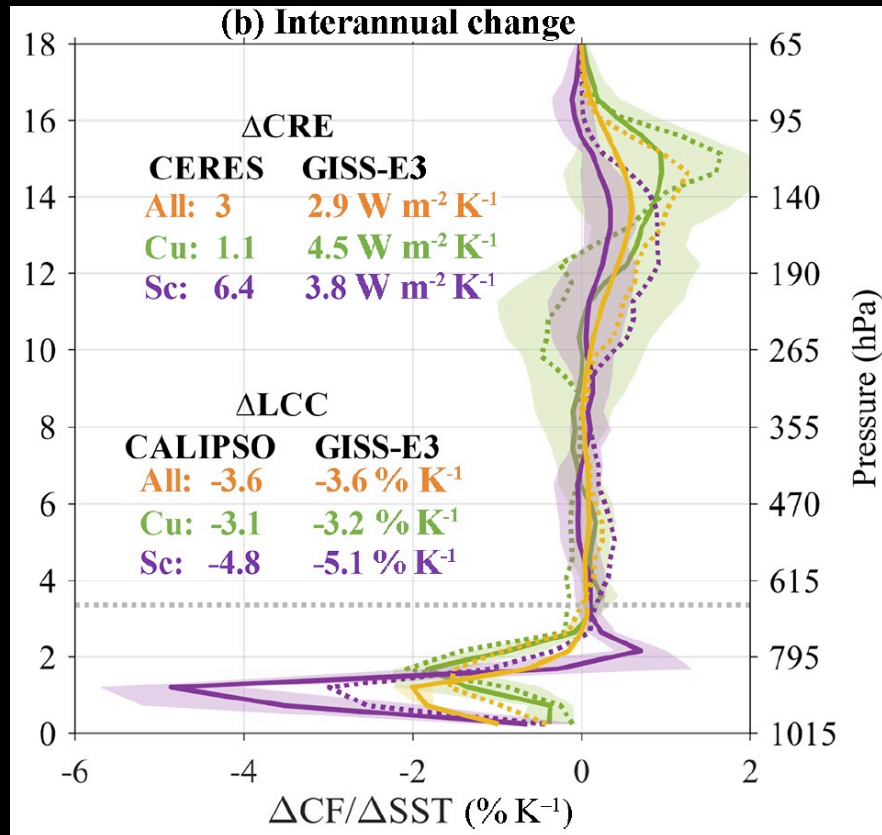
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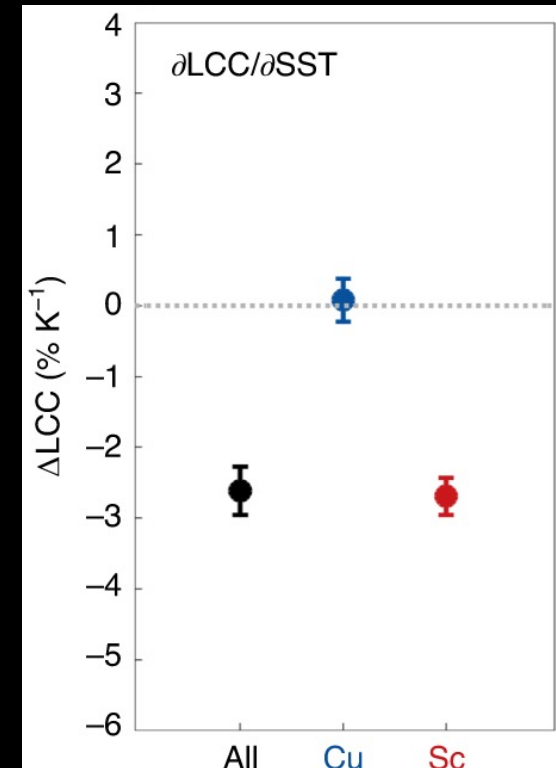
# Weak sensitivity of trade cumulus to SST perturbations relative to stratocumulus explains different feedbacks



# Independent observational evidence from active satellites



Cesana et al. (2019)

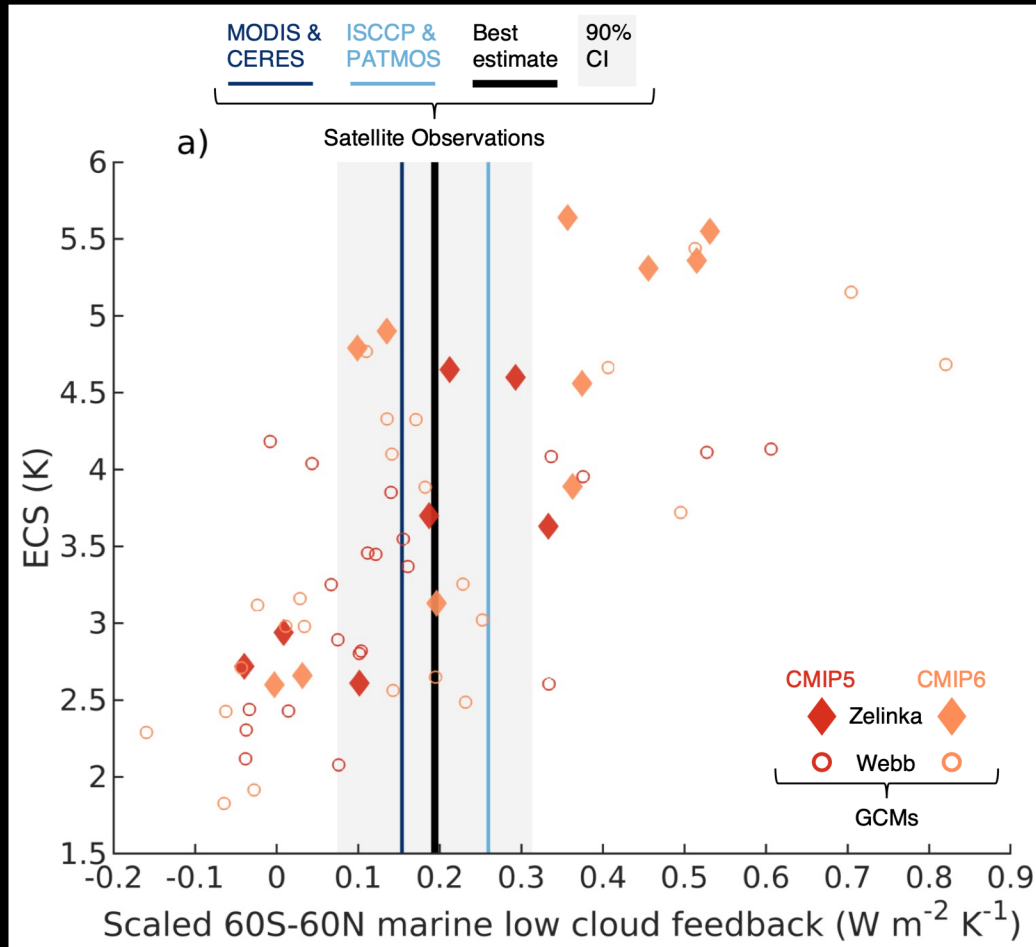


Cesana and Del Genio (2021)

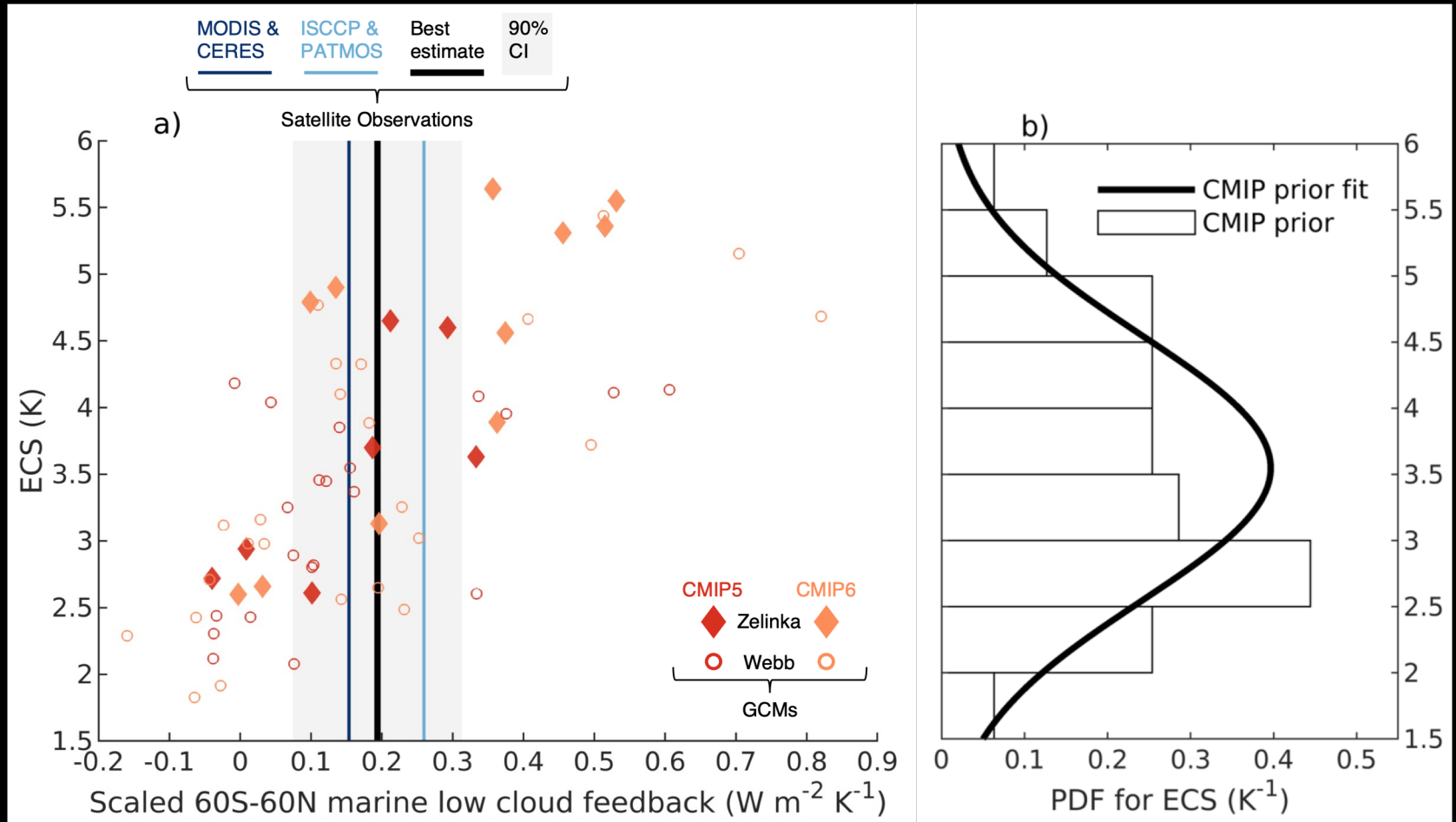
Cesana and Del Genio (2021) also conclude that the trade cumulus feedback is near-zero.

Implications for ECS  
Two methods

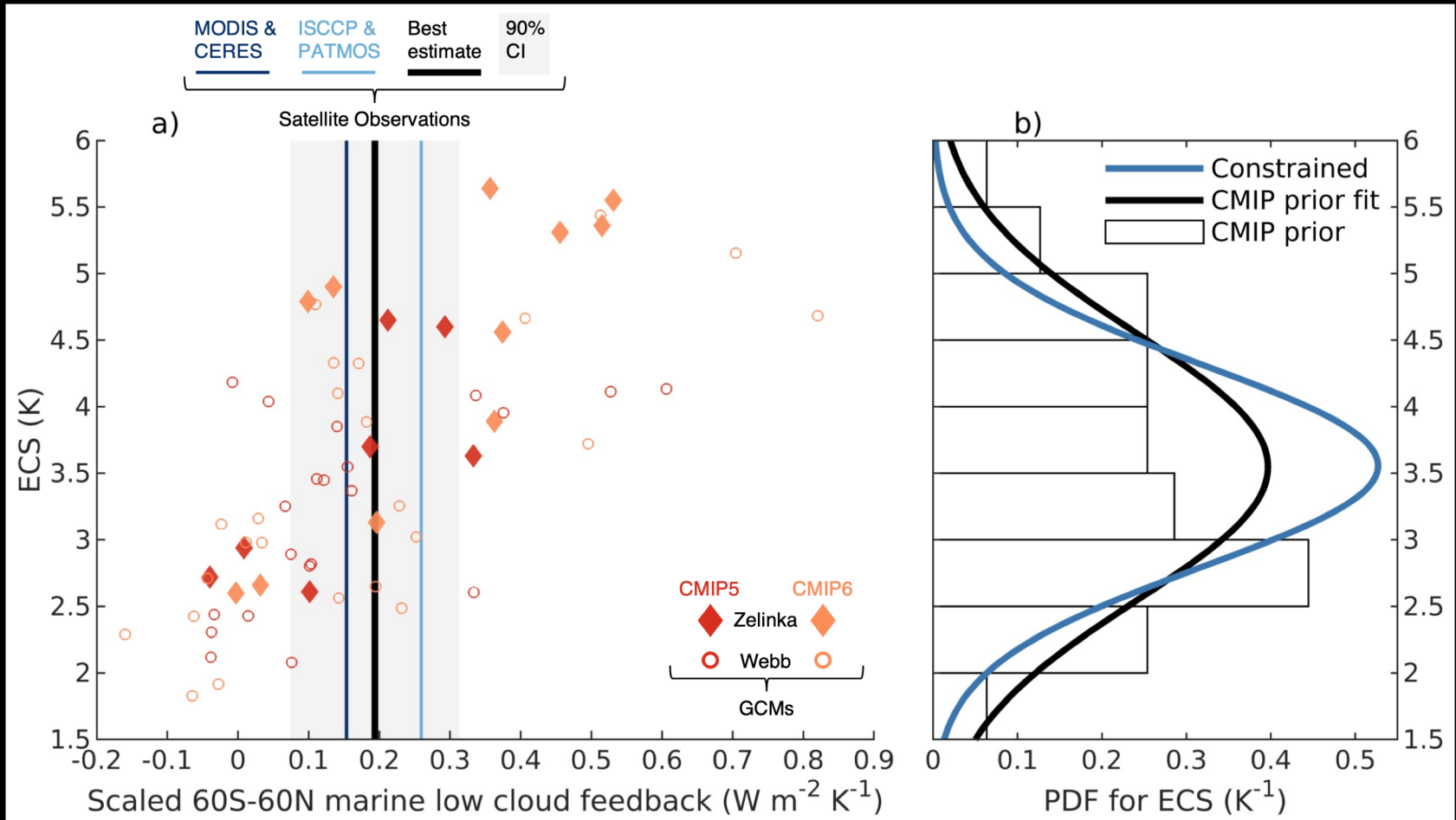
# Implications for ECS Method 1: Emergent-Constraint Approach



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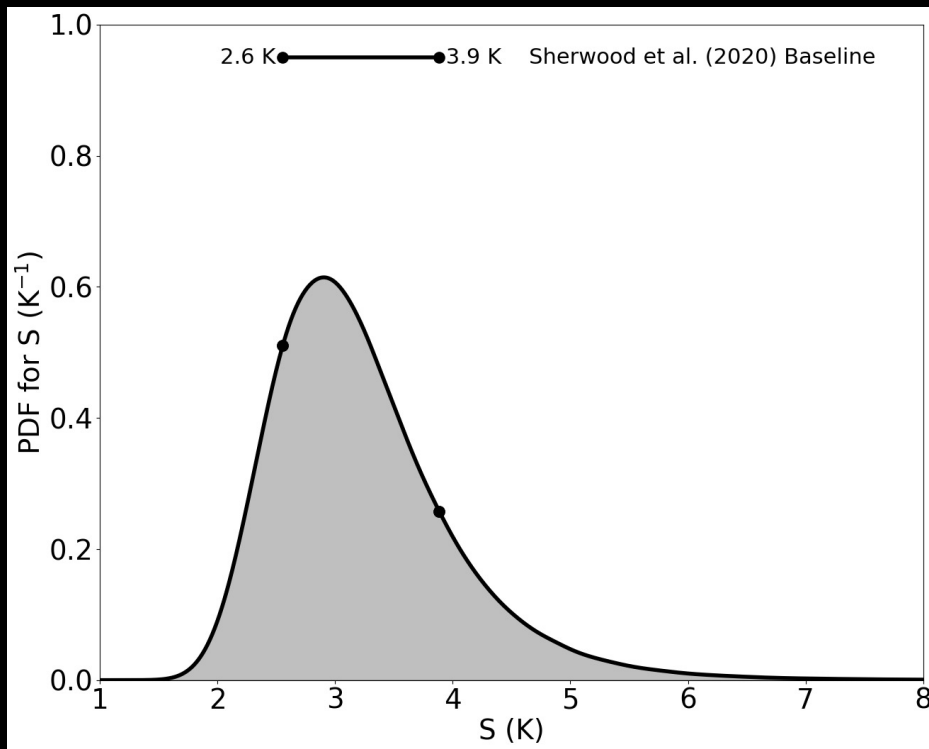


3% chance that  $\text{ECS} > 5 \text{ K}$   
8% chance that  $\text{ECS} < 2.5 \text{ K}$

**\*Models with very low or very high  
climate sensitivities are likely unrealistic.\***

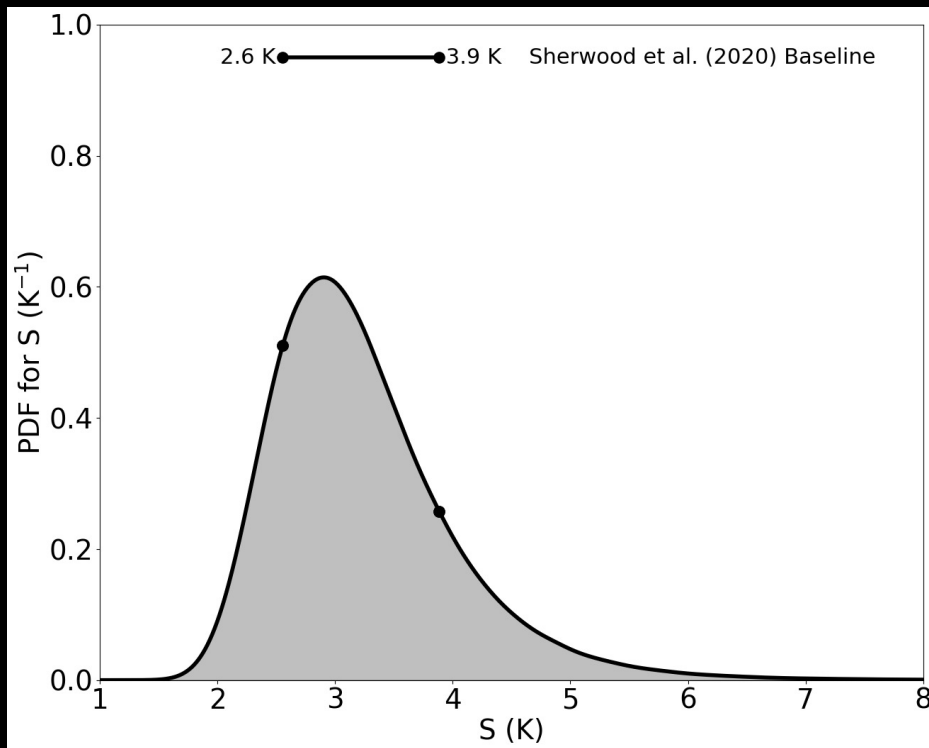


# Implications for ECS Method 2: Update to Climate Sensitivity (S) Inferred from Multiple Lines of Evidence



Sherwood et al. (2020) derive near-global marine low cloud feedback of  **$0.37 \pm 0.37 \text{ W m}^{-2} \text{ K}^{-1}$**  (sum of tropical and midlatitude marine low cloud amount and high-latitude low cloud optical depth feedbacks)

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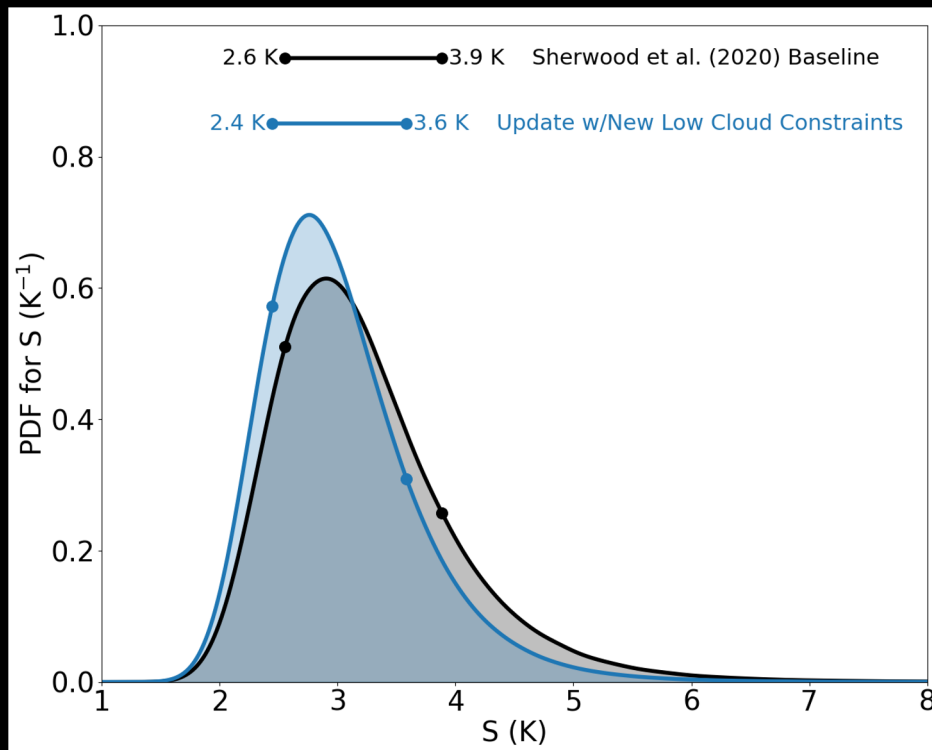
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Our estimate:  **$0.19 \pm 0.12 \text{ W m}^{-2} \text{ K}^{-1}$** . More realistic because:

- i) Explicit evidence that trade cumulus feedback weaker than stratocumulus feedback, in agreement with LES and independent observational evidence
- ii) Most comprehensive set of cloud-controlling factors of all studies

→ Replace Sherwood et al. (2020) low cloud feedback value with ours, leaving all other terms unchanged.

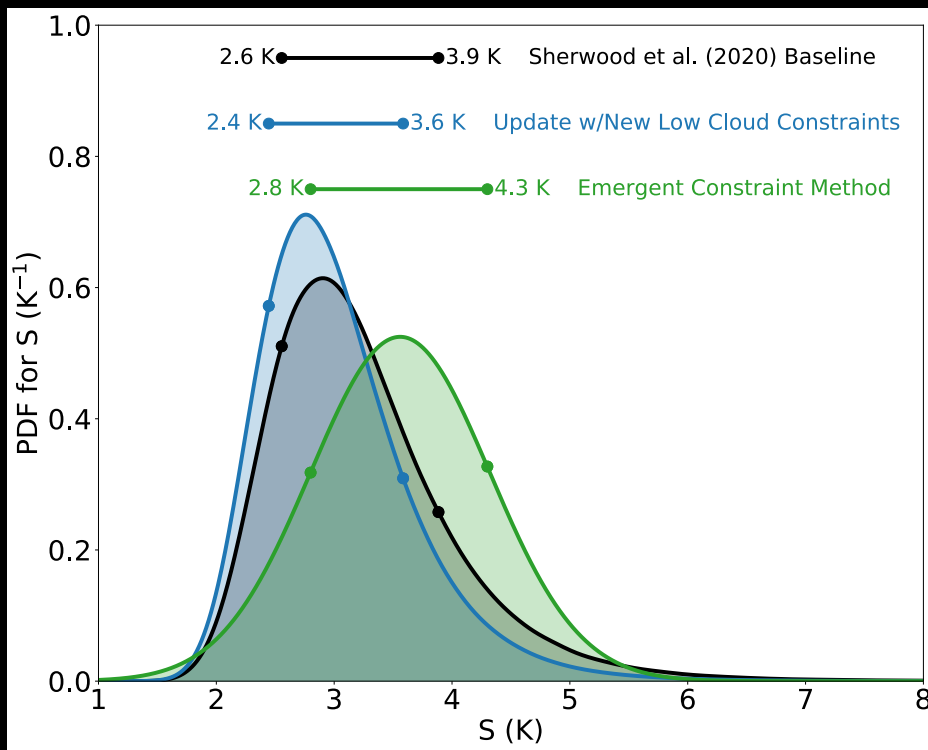
# Implications for ECS Method 2: Update to Climate Sensitivity (S) Inferred from Multiple Lines of Evidence



Our estimate points to a more moderate climate sensitivity ( $\sim 3$  K)

The chance that  $S > 5$  K has been reduced by more than half, from 3.1 % to 1.2 %

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The chance that  $S > 5$  K has been reduced by more than half, from 3.1 % to 1.2 %

**Emergent-Constraint Approach:** major limitations for inferring real-world climate sensitivity

# Summary

Observational  
*meteorological cloud radiative kernels* × GCM simulations of  
*meteorological changes with warming* = low cloud feedbacks

- ✓ Valid for observed out-of-sample extreme event
- ✓ Predicts positive stratocumulus and midlatitude low cloud feedbacks
- ✓ Predicts near-zero trade cumulus feedback
- ✓ Predicts 60S-60N feedback of  $0.19 \pm 0.12 \text{ W m}^{-2} \text{ K}^{-1}$
- ✓ Implies ECS near 3 K, reduces likelihood of very low or very high ECS

## References

Myers, T. A., R. C. Scott, M. D. Zelinka, S. A. Klein, J. R. Norris, and P. M. Caldwell, 2021: Observational Constraints on Low Cloud Feedback Reduce Uncertainty of Climate Sensitivity. *Nature Climate Change*

Scott, R. C., T. A. Myers, J. R. Norris, M. D. Zelinka, S. A. Klein, M. Sun, and D. R. Doelling, 2020: Observed sensitivity of low cloud radiative effects to meteorological perturbations over the global oceans. *J. Climate*, doi: <https://doi.org/10.1175/JCLI-D-19-1028.1>.

# Meteorological Cloud Radiative Kernels Available at: [https://github.com/tamyers87/meteorological\\_cloud\\_radiative\\_kernels](https://github.com/tamyers87/meteorological_cloud_radiative_kernels)

tamyers87 / meteorological\_cloud\_radiative\_kernels

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Code



tamyers87 Update README.md

cb56e6e on Jan 5

4 commits



README.md

Update README.md

4 months ago



Scott\_Myers\_meteorological\_kernel...

Add files via upload

4 months ago



Scott\_Myers\_meteorological\_kernel...

Add files via upload

4 months ago



Scott\_Myers\_meteorological\_kernel...

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## Meteorological Cloud Radiative Kernels

*Meteorological cloud radiative kernels* quantify the response of top-of-atmosphere marine low cloud radiative effect to local large-scale meteorological perturbations. They were developed by [Scott et al. \(2020\)](#) and applied in Myers et al. (2021). These kernels are derived using cloud-controlling factor (CCF) analysis, which is based upon theoretical and high-resolution model evidence that marine boundary layer properties, including cloudiness, are predominantly determined by large-scale meteorological environmental factors. In our analysis, these CCFs include sea-surface temperature (SST), estimated inversion strength (EIS), horizontal surface temperature advection ( $Tadv$ ), relative humidity at 700 hPa ( $RH_{700}$ ), vertical velocity at 700 hPa ( $w_{700}$ ), and near-surface wind speed (WS).

The *meteorological cloud radiative kernels* are calculated by applying multi-linear regression of detrended interannual monthly anomalies of satellite-derived low cloud radiative flux onto anomalies in CCFs from a reanalysis

### About

Netcdf files of meteorological cloud radiative kernels developed by Scott et al. (2020) and applied in Myers et al. (2021).

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### Releases

No releases published

### Packages

No packages published

# Meteorological Cloud Radiative Kernels Available at: [https://github.com/tamyers87/meteorological\\_cloud\\_radiative\\_kernels](https://github.com/tamyers87/meteorological_cloud_radiative_kernels)

tamyers87 / meteorological\_cloud\_radiative\_kernels

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Can be used to investigate:

- Cloud feedbacks associated with internal climate variability (e.g. ENSO, AMO)
- Cloud feedbacks associated with paleoclimates
- Multi-decadal cloud trends
- The performance of global climate models and large-eddy simulations

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A satellite image showing the Gulf of Mexico and Central America. The Gulf is filled with a dense layer of white clouds, while the landmasses to the north and south are visible in shades of brown and green. The text "Thank you!" is overlaid in blue on the left side of the image.

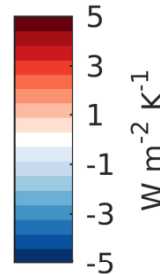
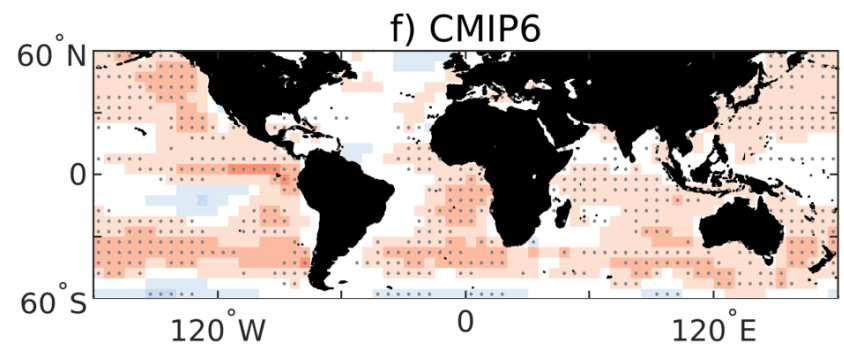
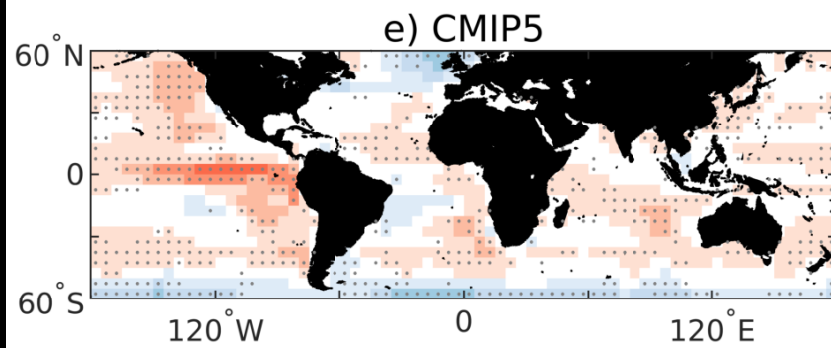
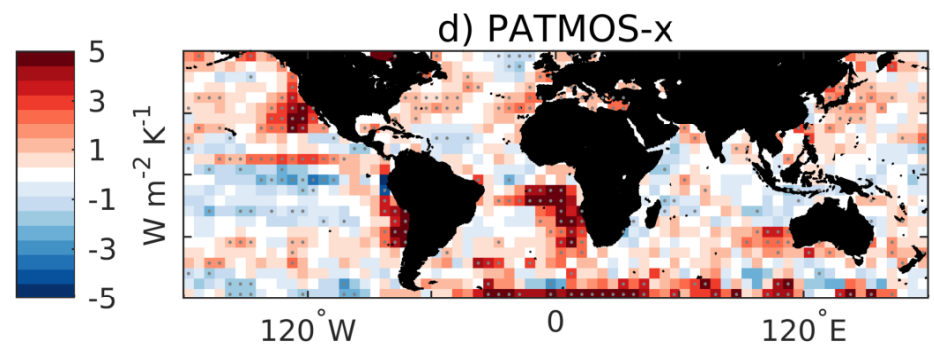
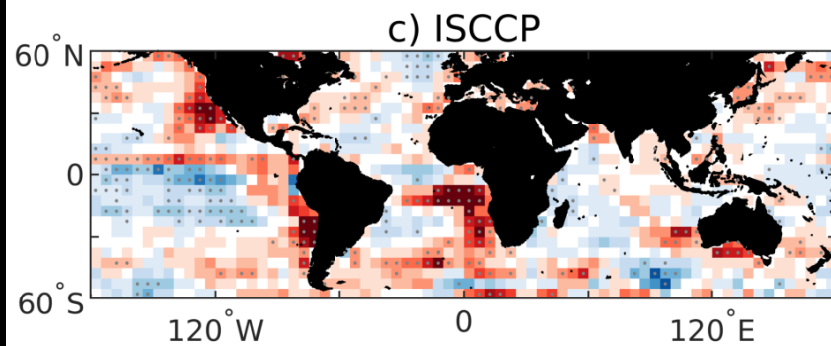
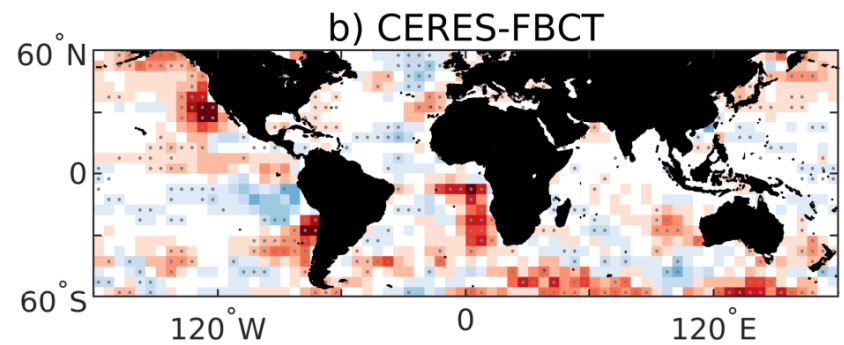
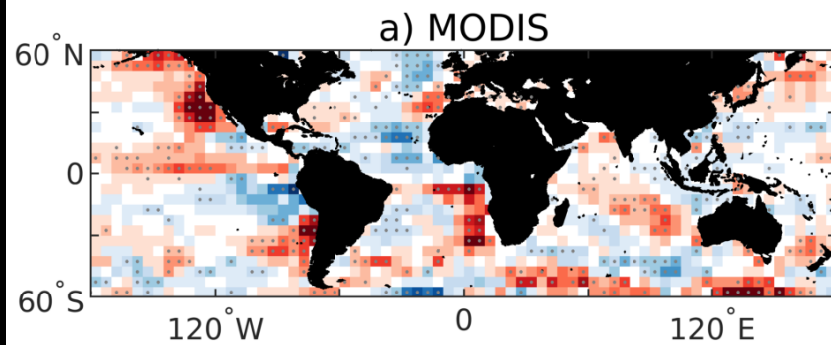
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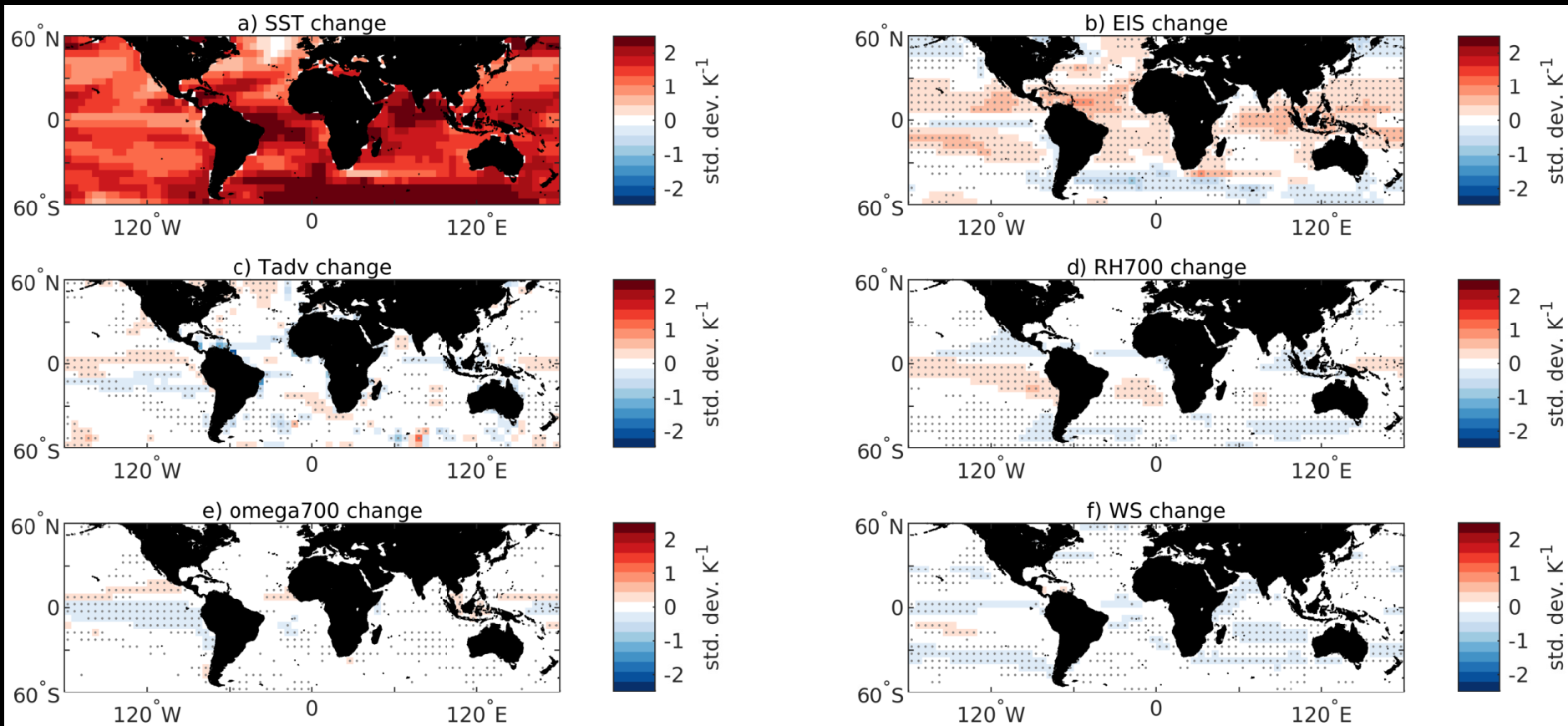
MODIS



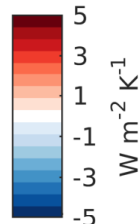
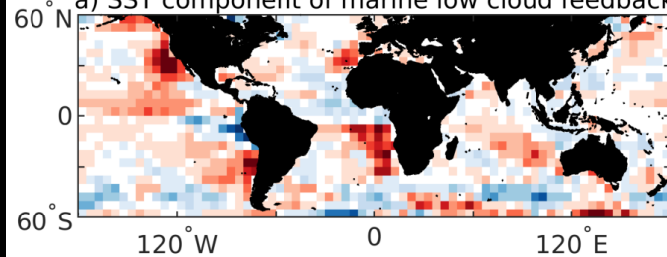
Extras slides

## Marine Low Cloud Feedback

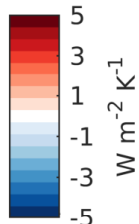
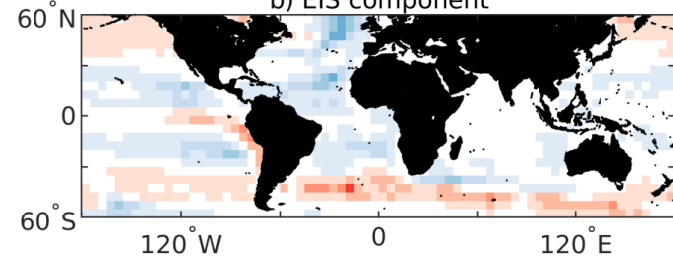




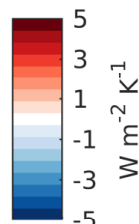
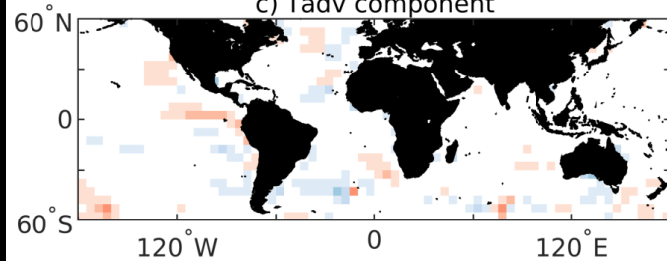
a) SST component of marine low cloud feedback



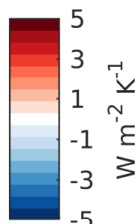
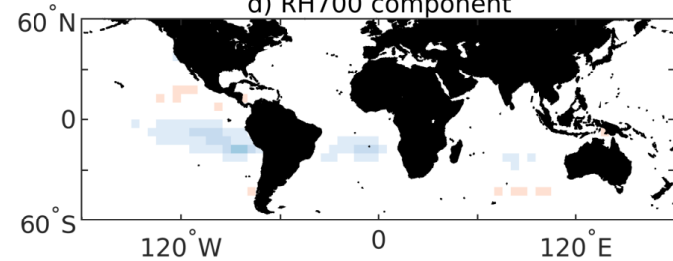
b) EIS component



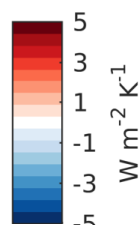
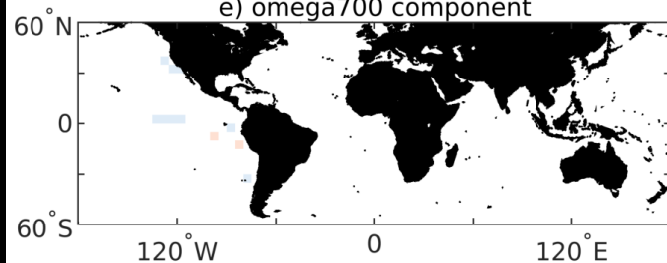
c) Tadv component



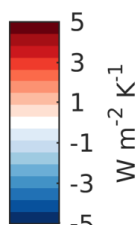
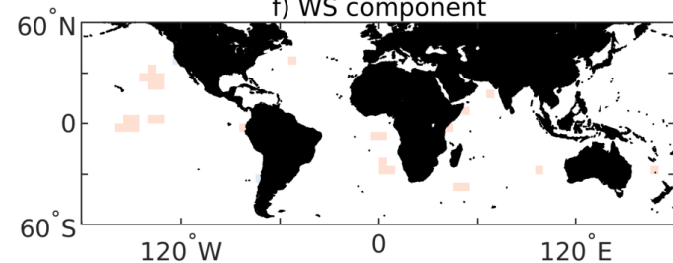
d) RH700 component



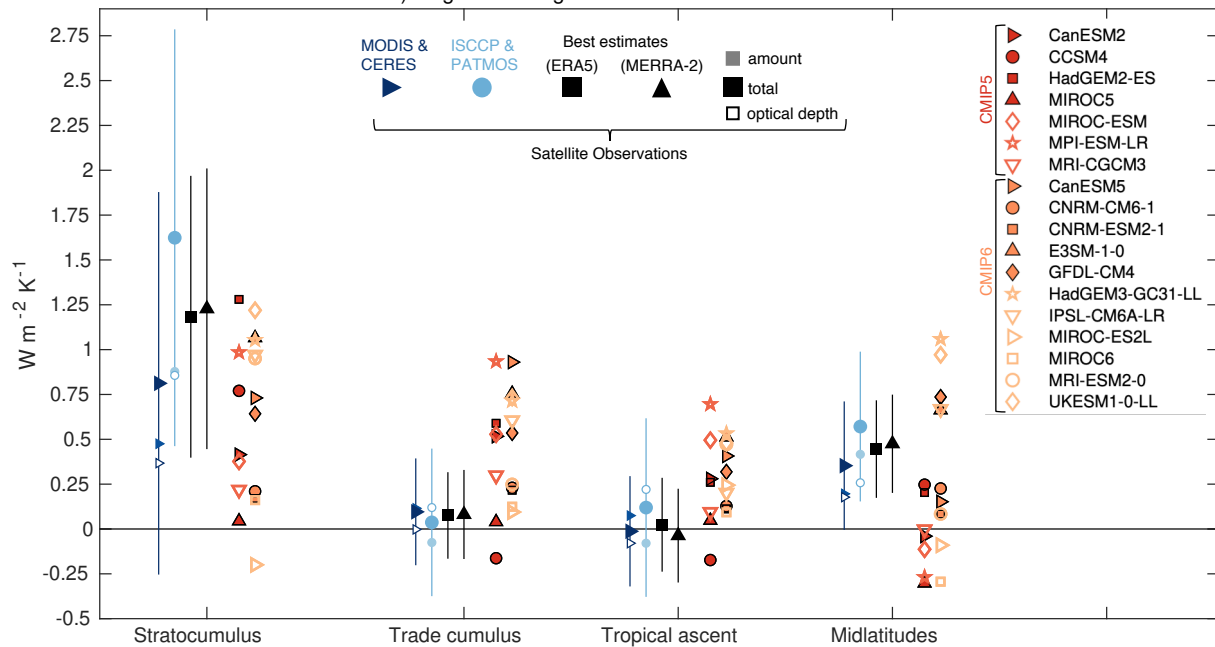
e) omega700 component



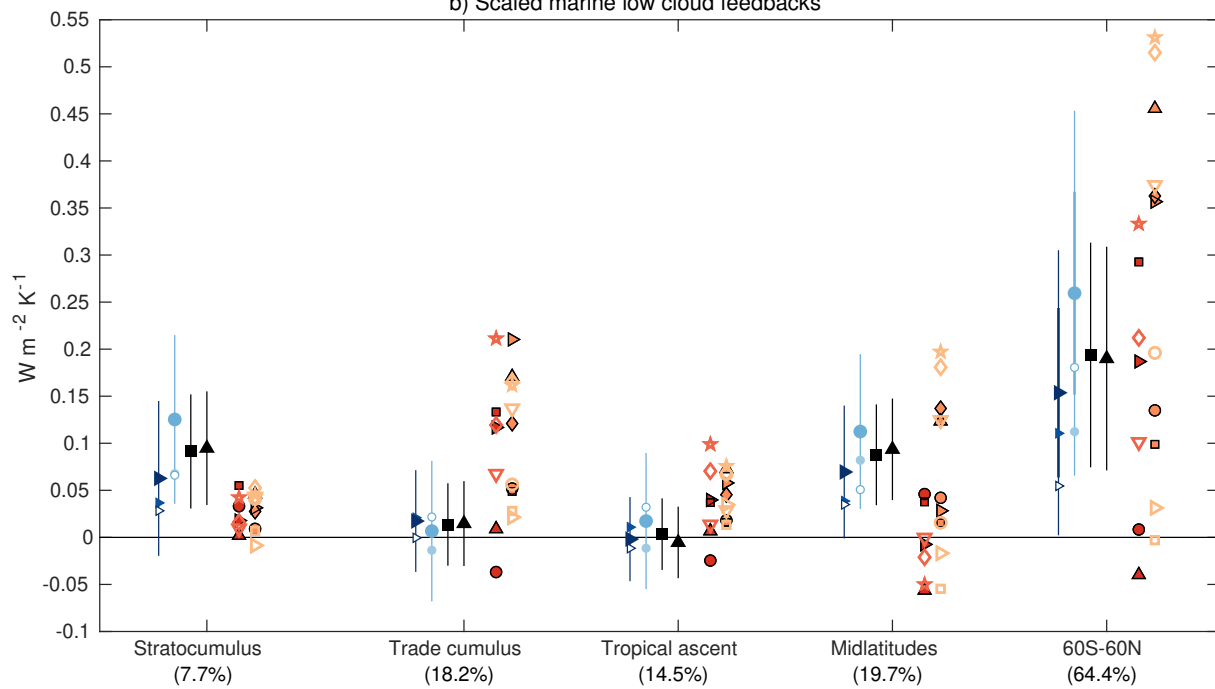
f) WS component



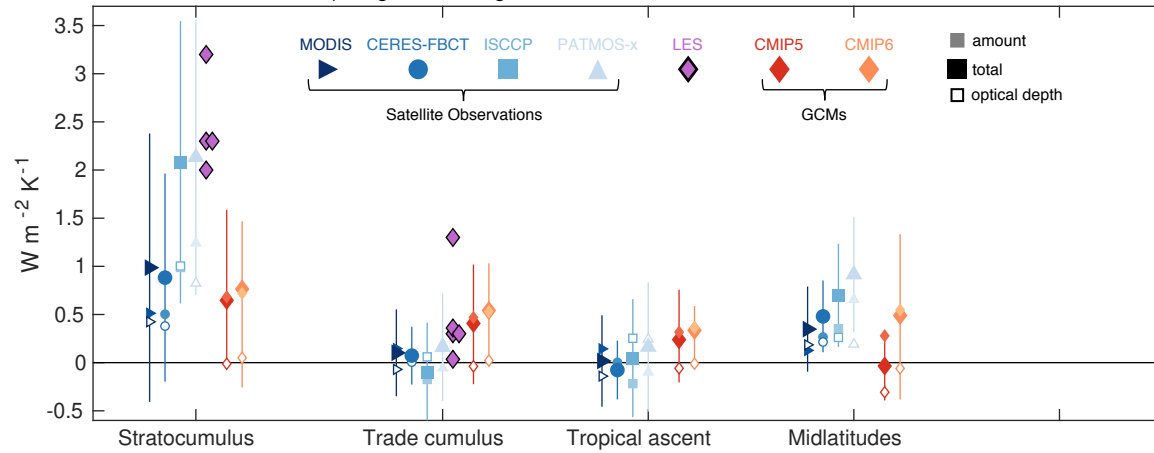
a) Regime-averaged marine low cloud feedbacks



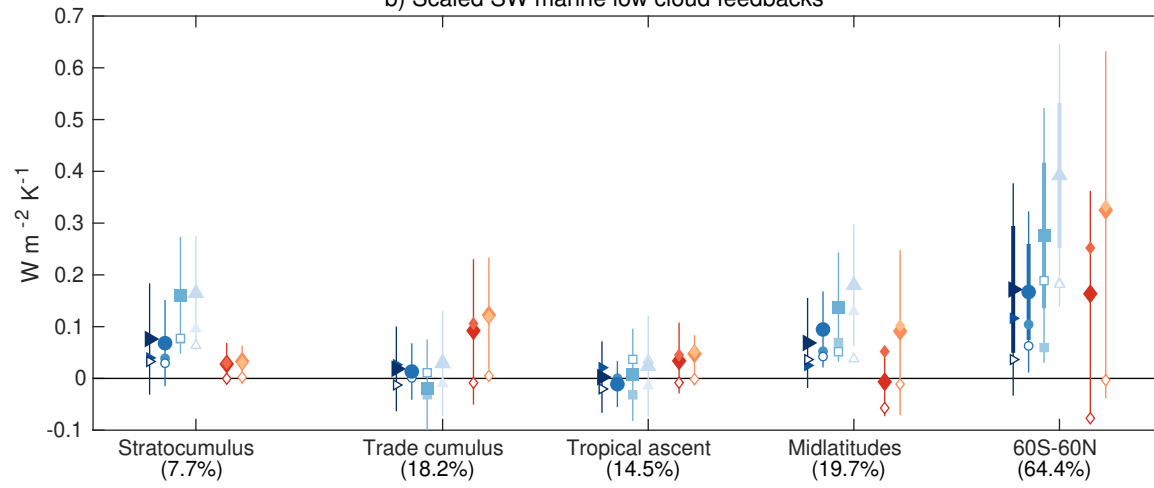
b) Scaled marine low cloud feedbacks

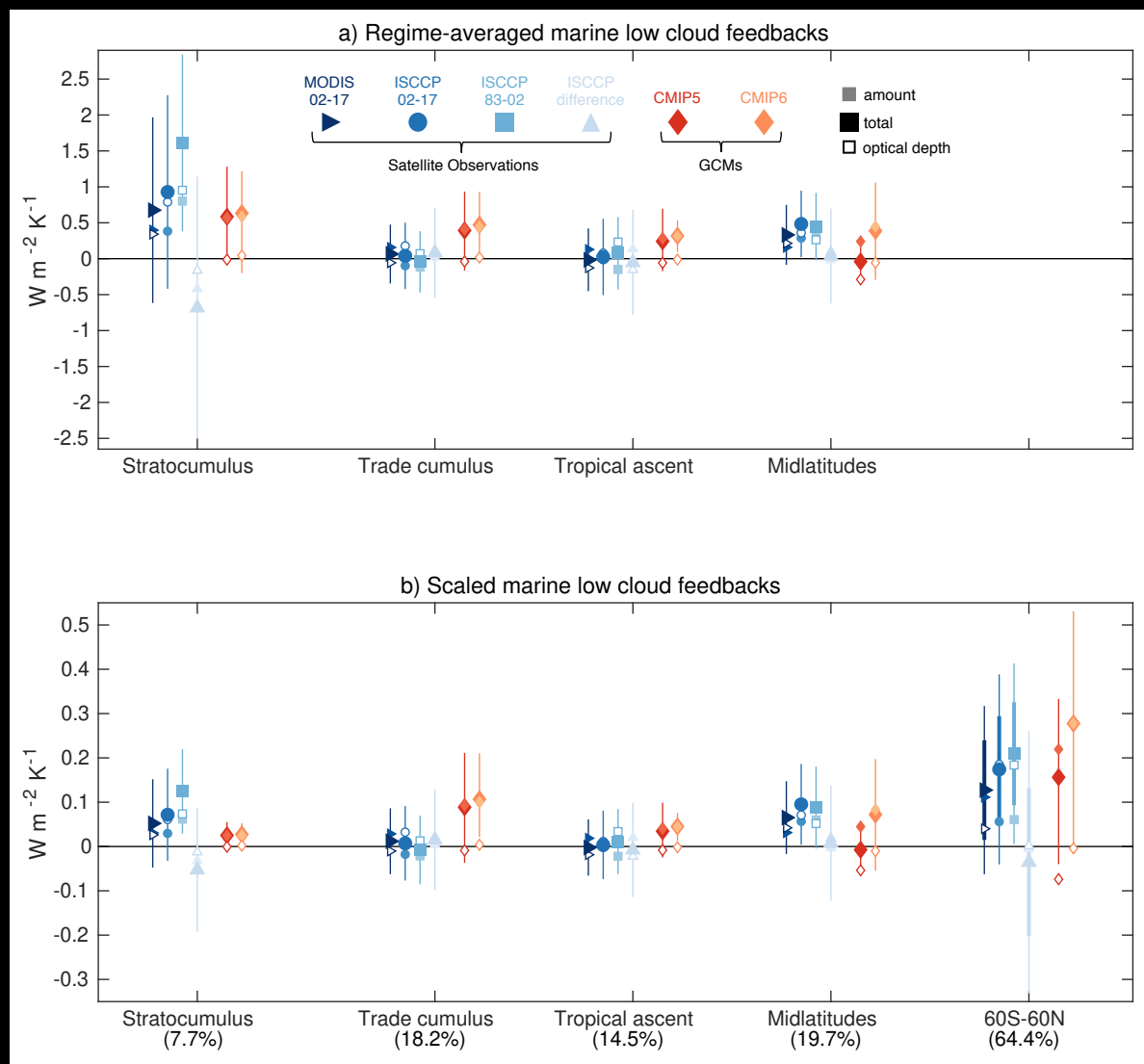


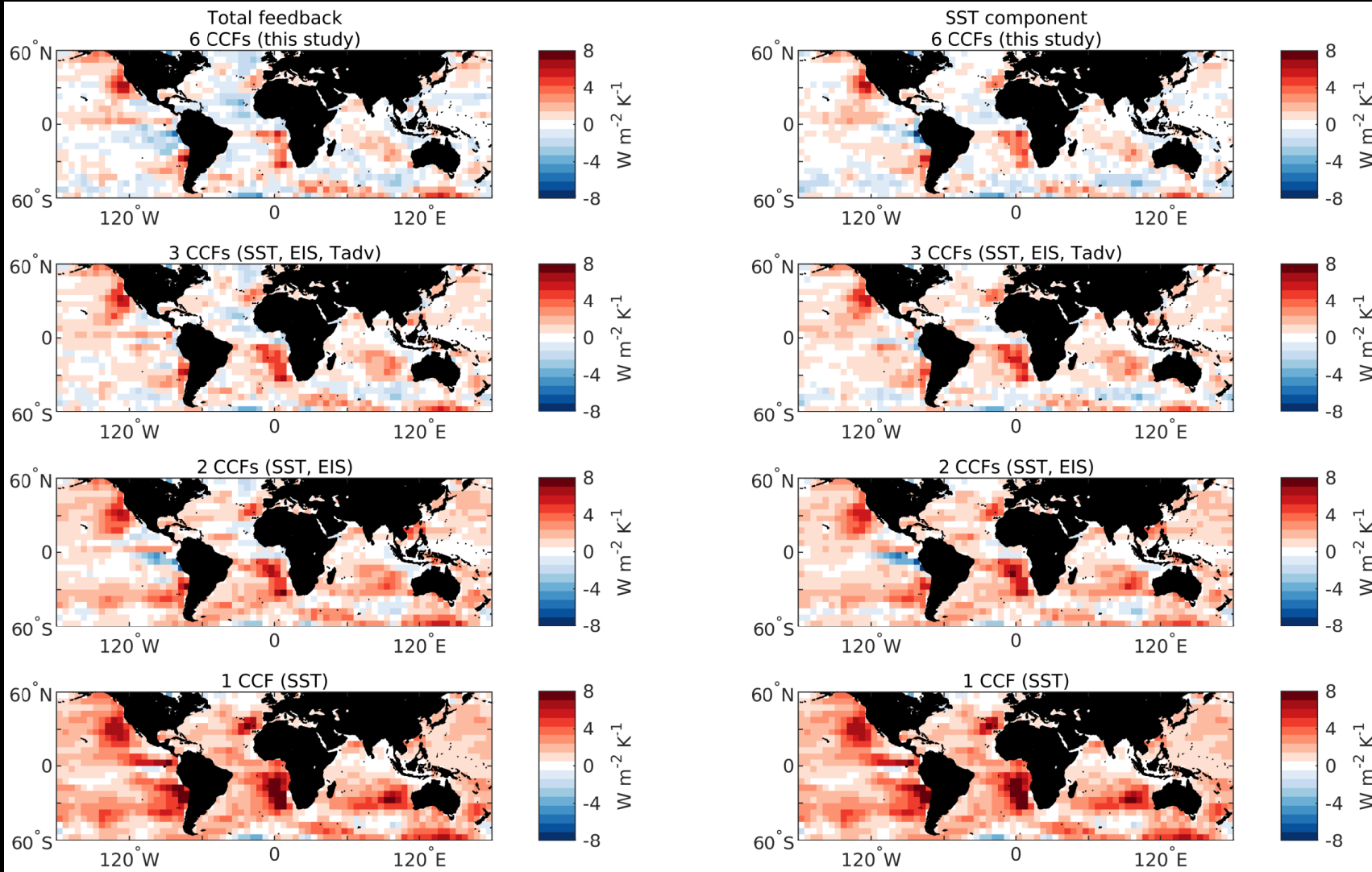
a) Regime-averaged SW marine low cloud feedbacks



b) Scaled SW marine low cloud feedbacks



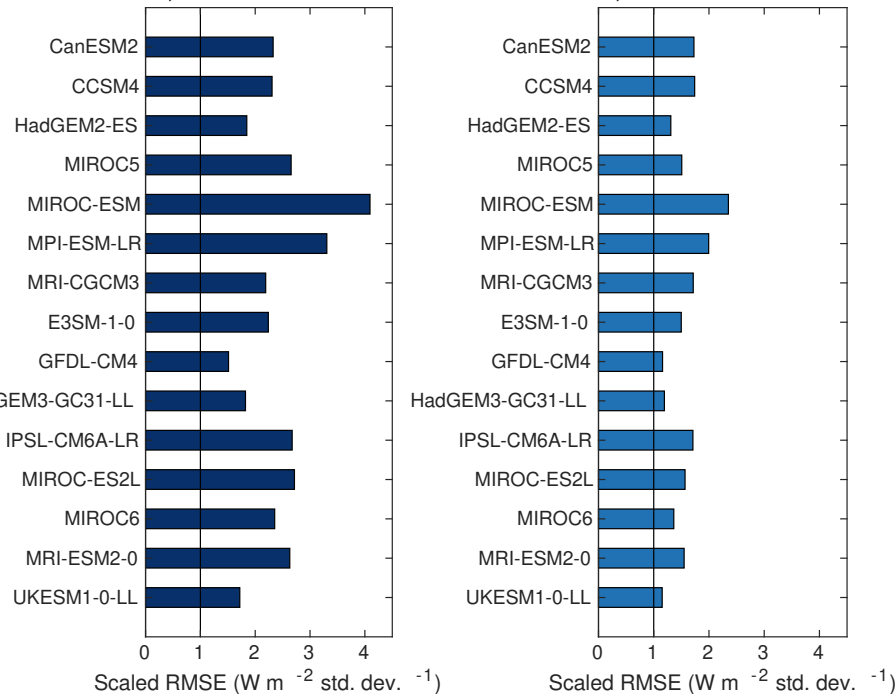




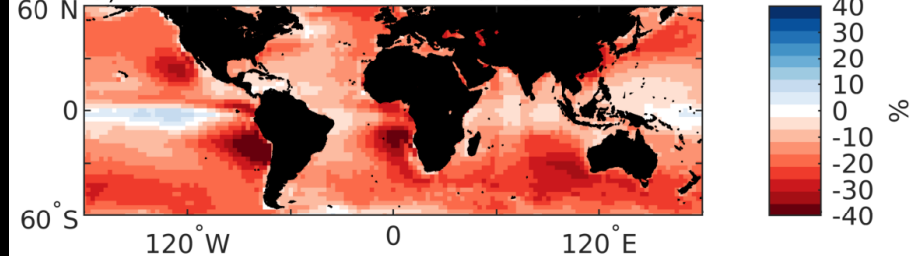


a) MODIS & CERES

b) ISCCP & PATMOS



a) CMIP5 mean minus ISCCP low cloud fraction



b) CMIP6 mean minus ISCCP low cloud fraction

